



## Retinal waves: experiments and theory

Bruno Cessac, Dora Karvouniari, Lionel Gil, Olivier Marre, Serge Picaud

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# Retinal waves: experiments and theory

**D. Karvouniari, Biovision team, INRIA, Sophia Antipolis**

L. Gil, INLN, Sophia Antipolis

O. Marre, Institut de la Vision, Paris

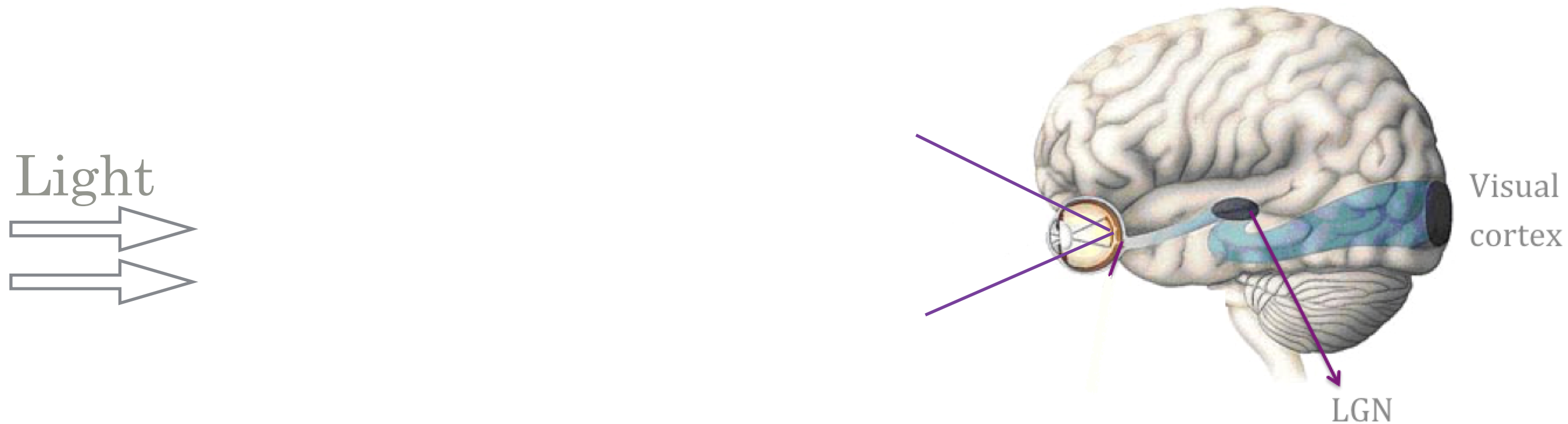
S. Picaud, Institut de la Vision, Paris

B. Cessac, Biovision team, INRIA, Sophia Antipolis

Acknowledgement: M. Hennig, E. Sernagor.

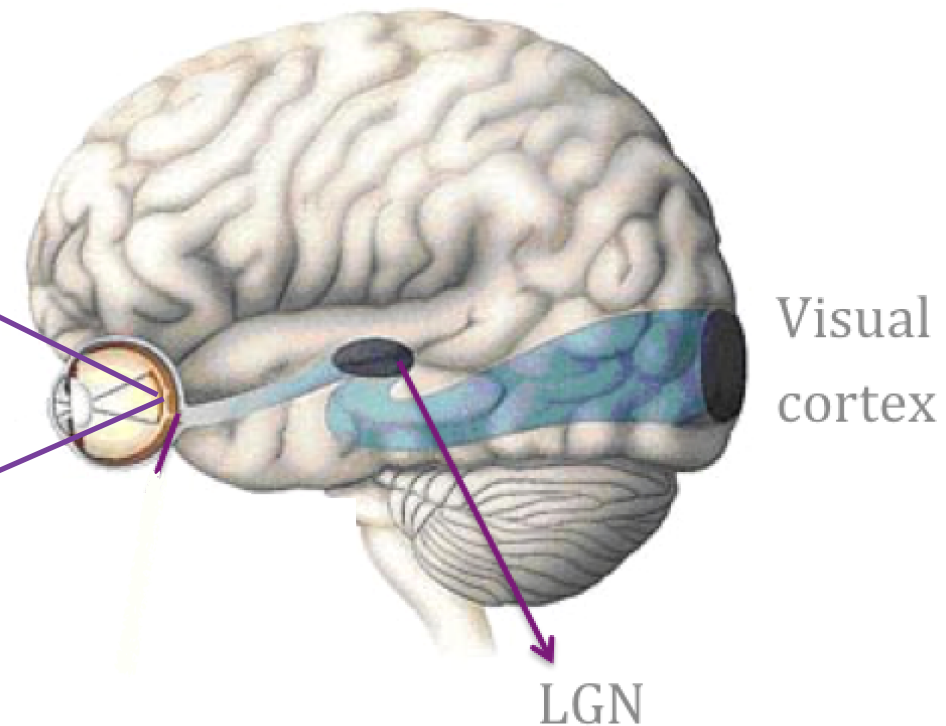
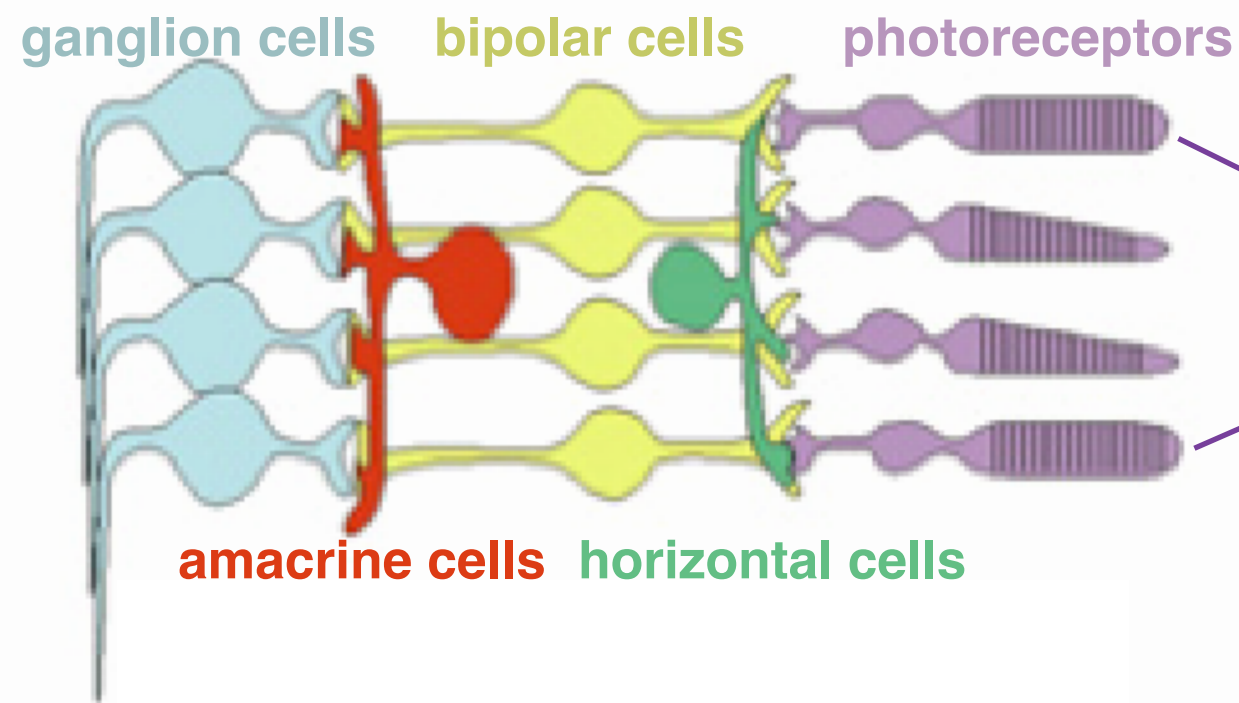


# The structure of the adult retina



# The structure of the adult retina

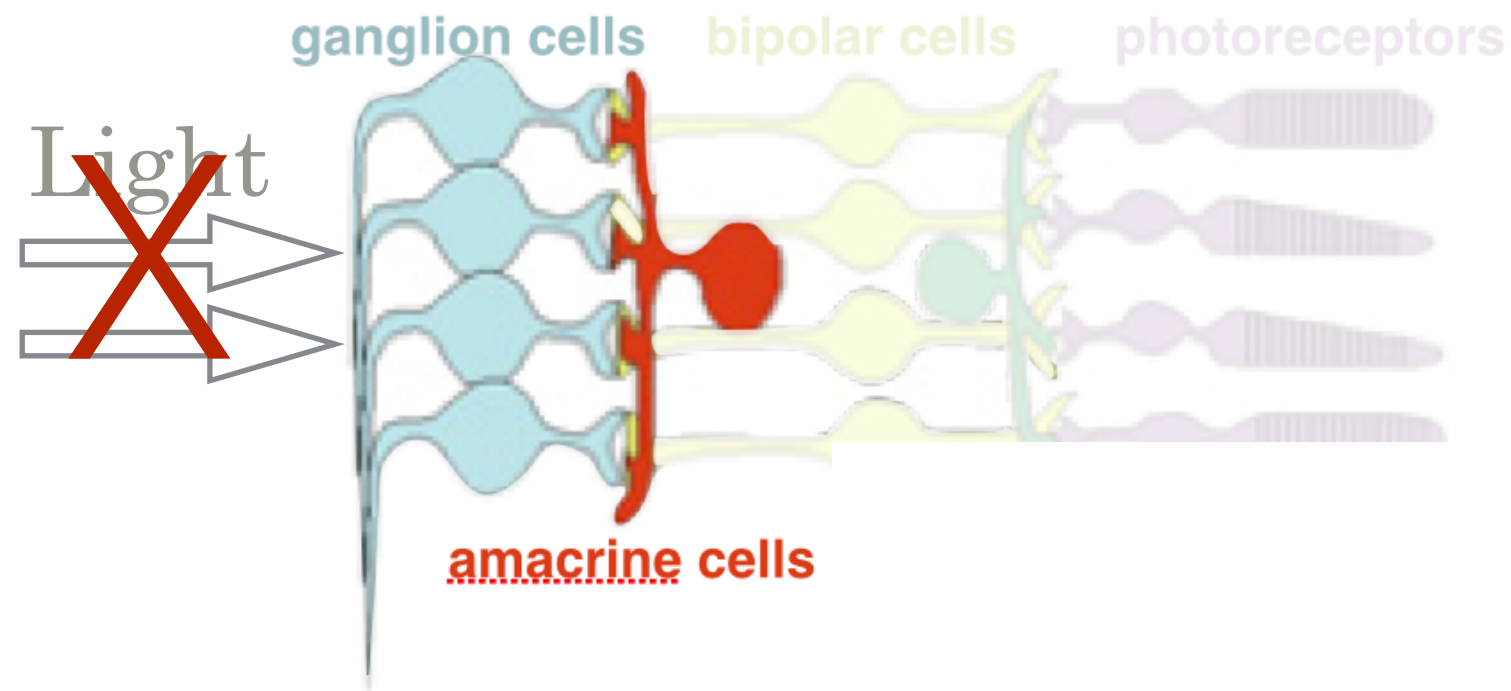
## Retina's layered structure





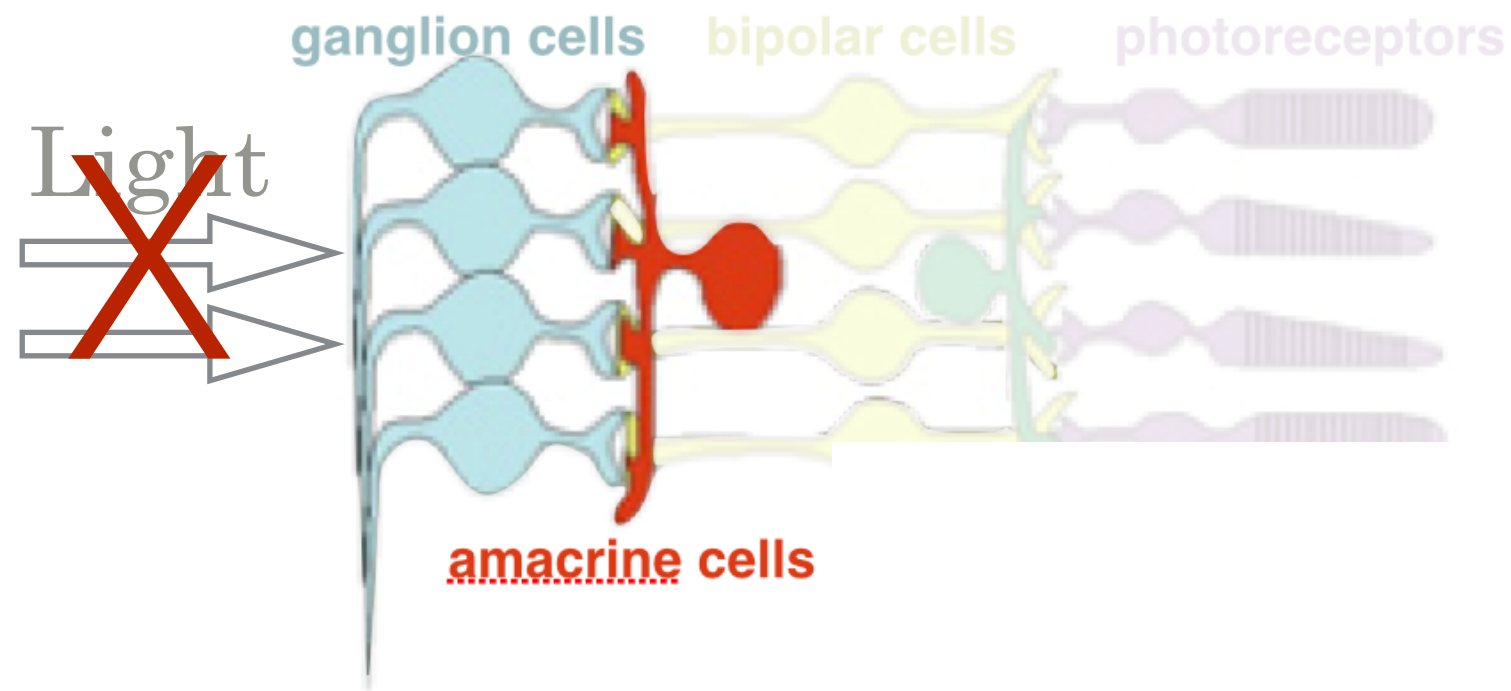
# The structure of the retina during development

Retina's layered structure  
is shaped during development



# The structure of the retina during development

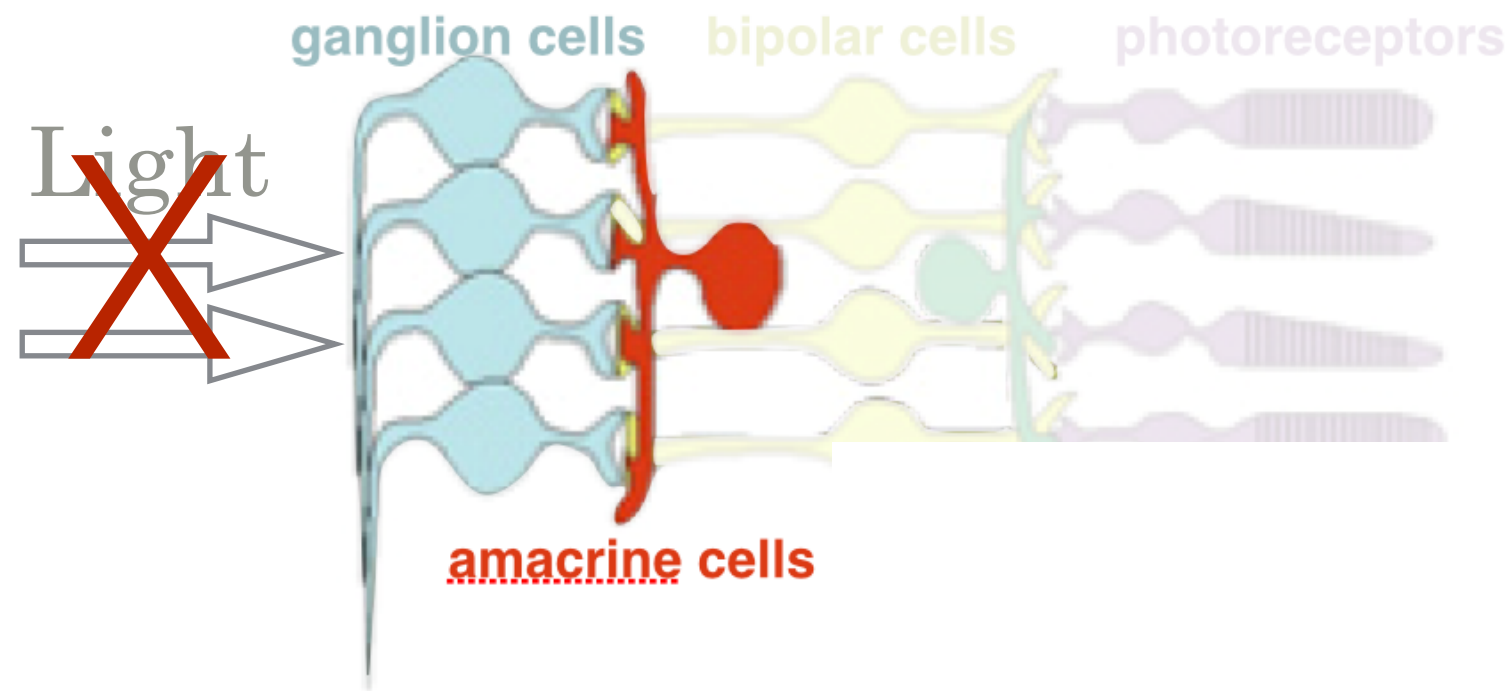
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But How?

# The structure of the retina during development

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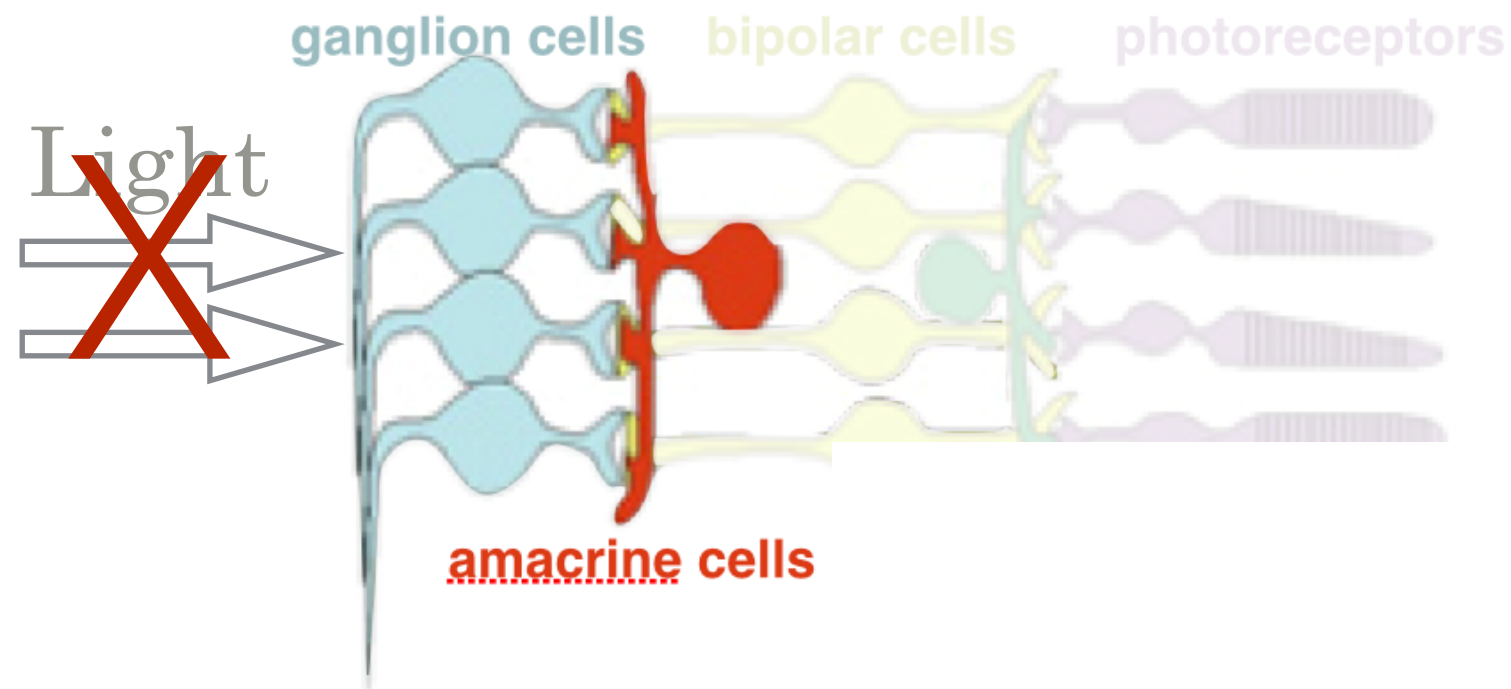


But How?



# The structure of the retina during development

Retina's layered structure  
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But How?



**Retinal waves!**

# What are Retinal waves?

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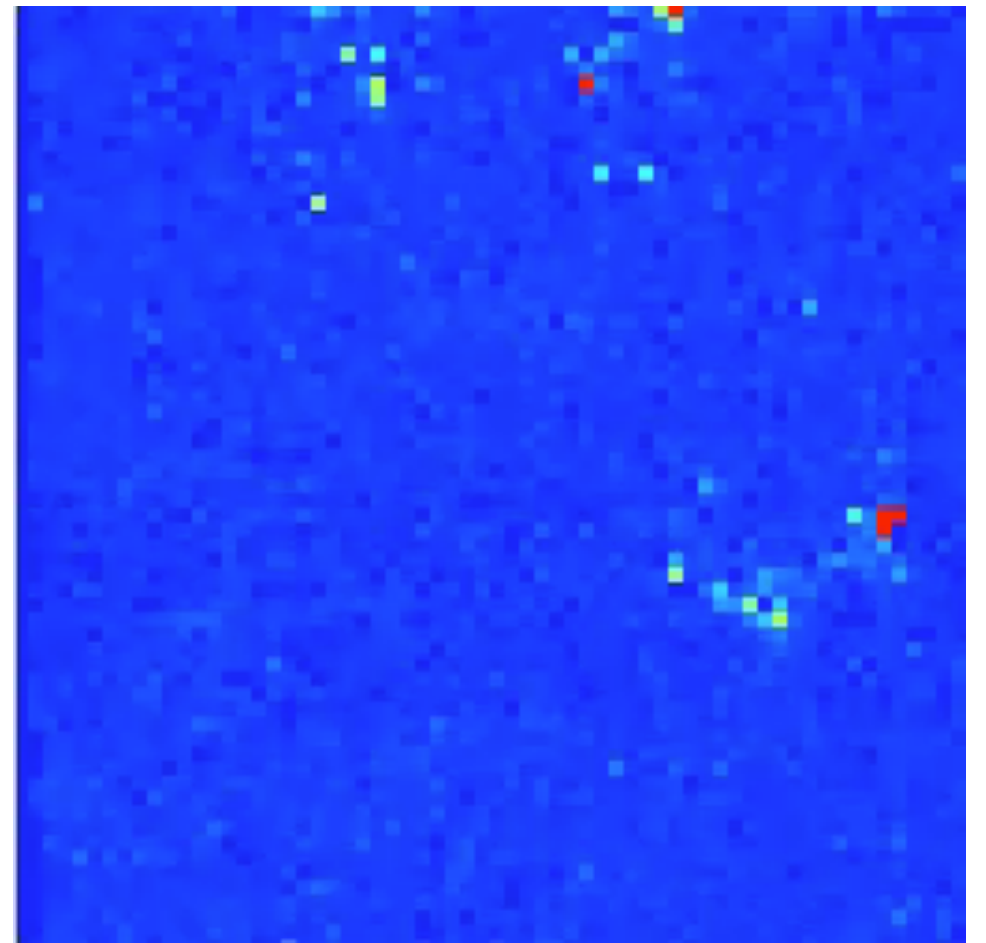
Spontaneous spatio-temporal waves during development

Disappear short after birth when vision is functional

# What are Retinal waves?

Spontaneous spatio-temporal waves during development

Disappear short after birth when vision is functional



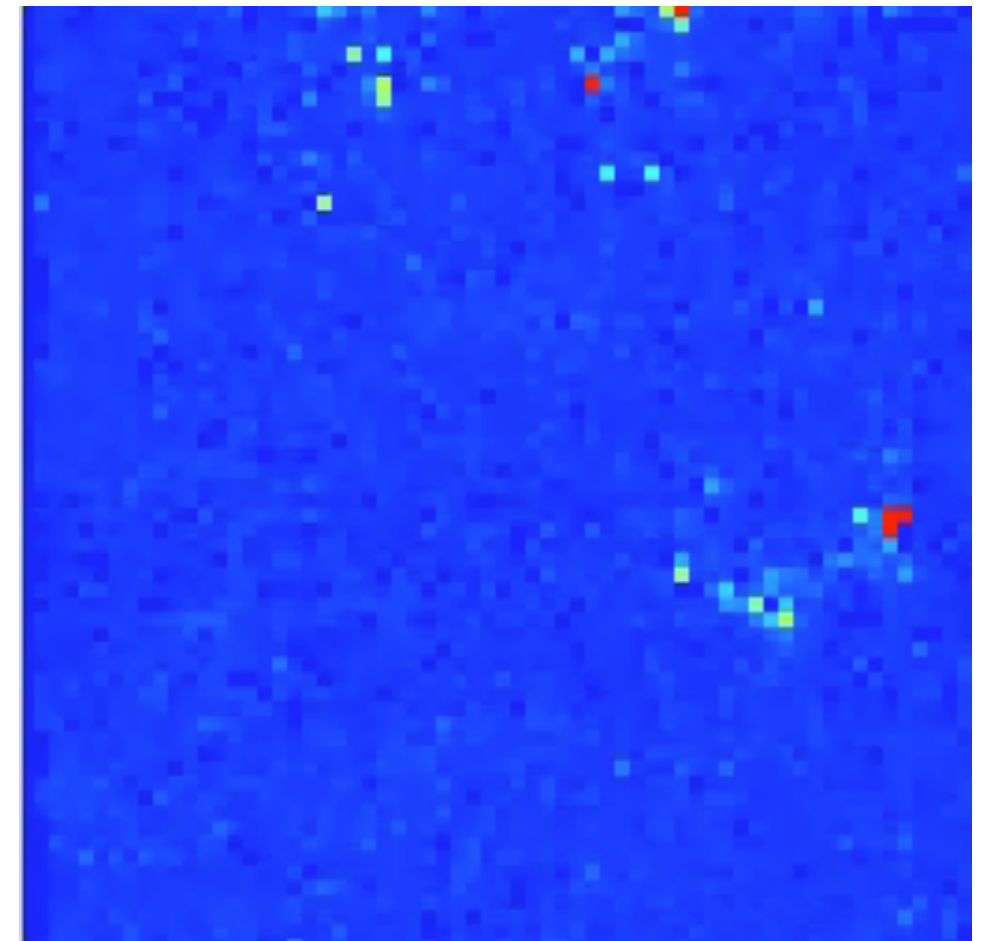
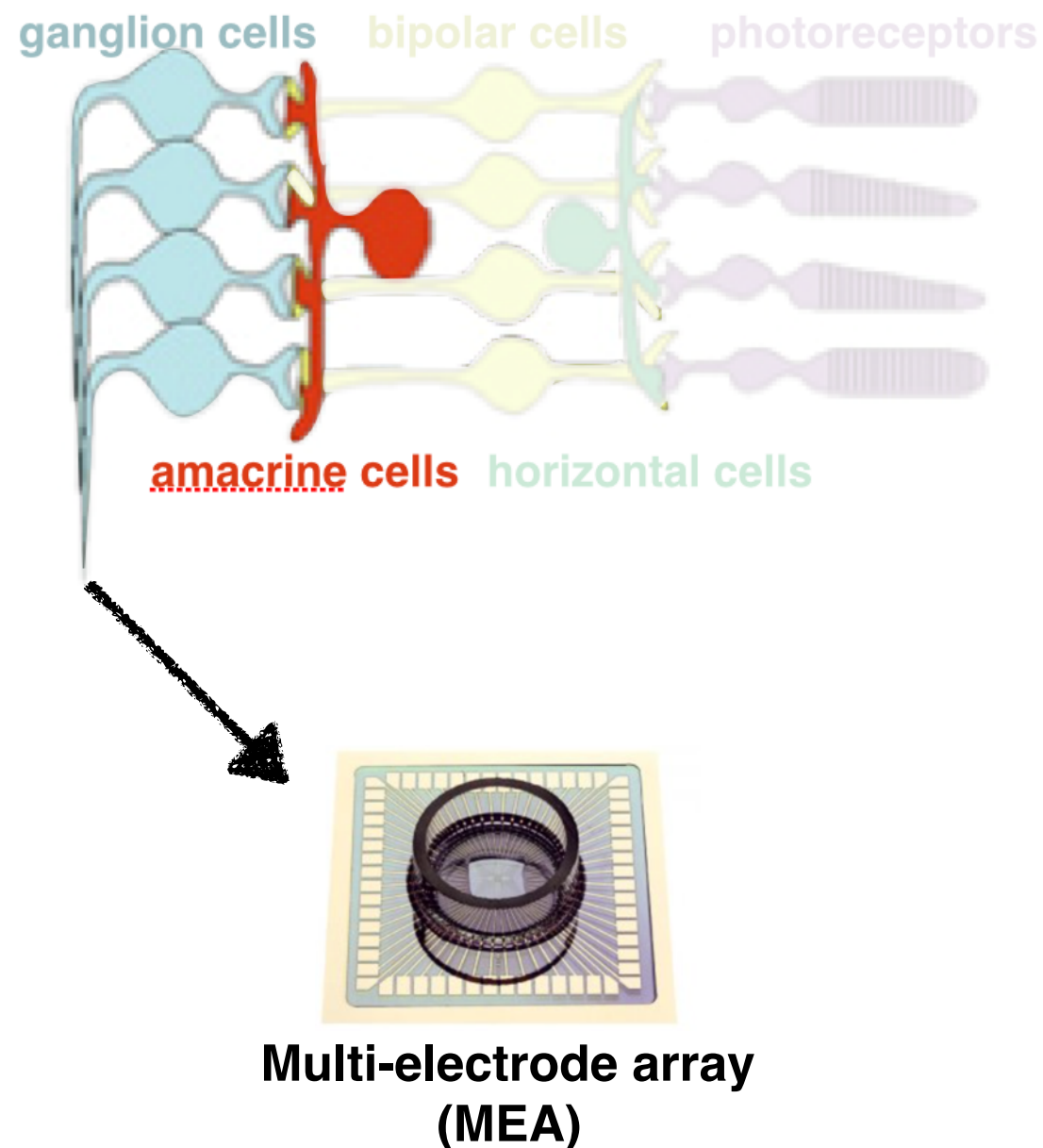
*(Maccione et al. 2014)*

*MEA recording of the voltage from a P11 mouse retina in the presence of 10  $\mu$ M bicuculline.*

# What are Retinal waves?

Spontaneous spatio-temporal waves during development  
Disappear short after birth when vision is functional

## Recordings from the retina



(Maccione et al. 2014)

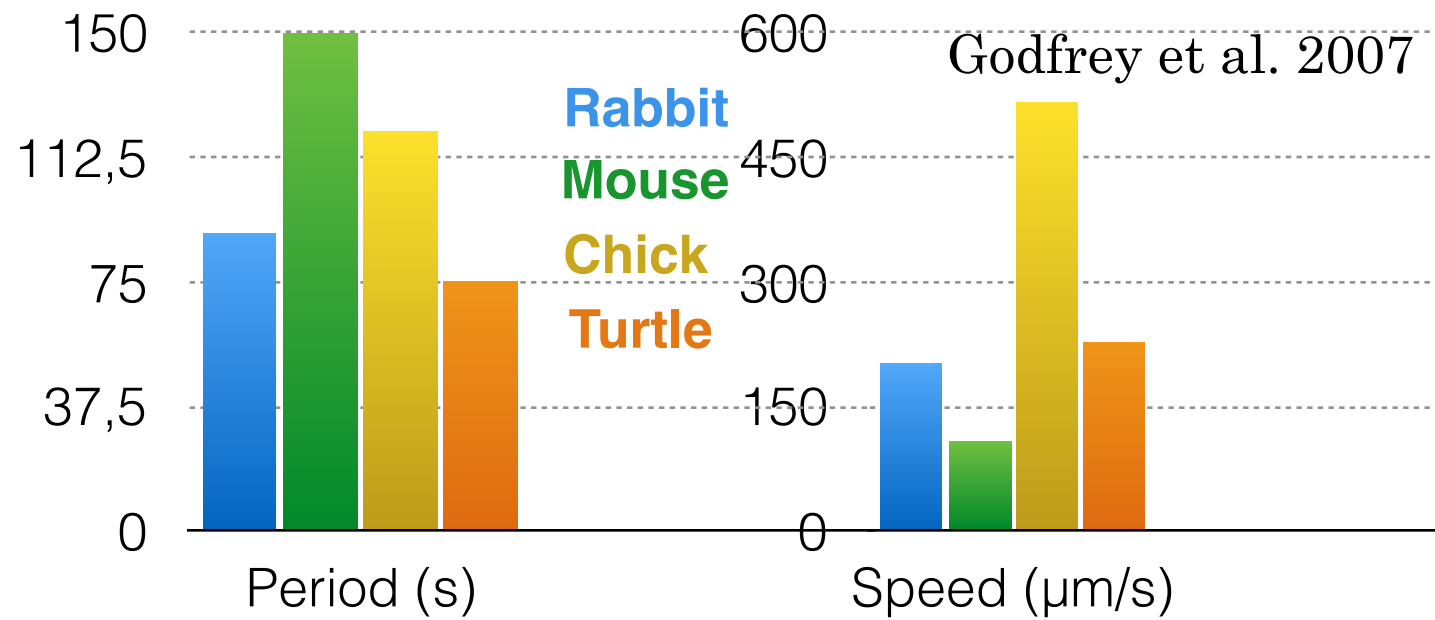
*MEA recording of the voltage from a P11 mouse retina in the presence of 10  $\mu$ M bicuculline.*



# Variability within retinal waves

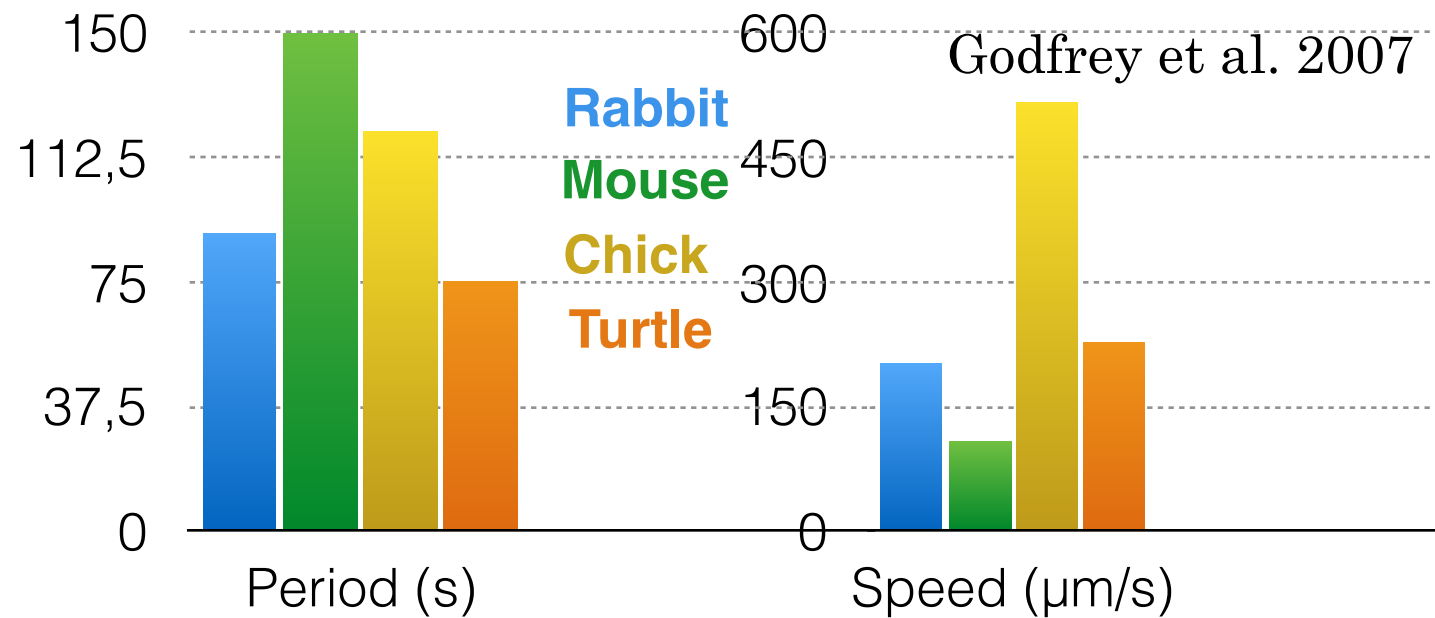
# Variability within retinal waves

## i) Across species

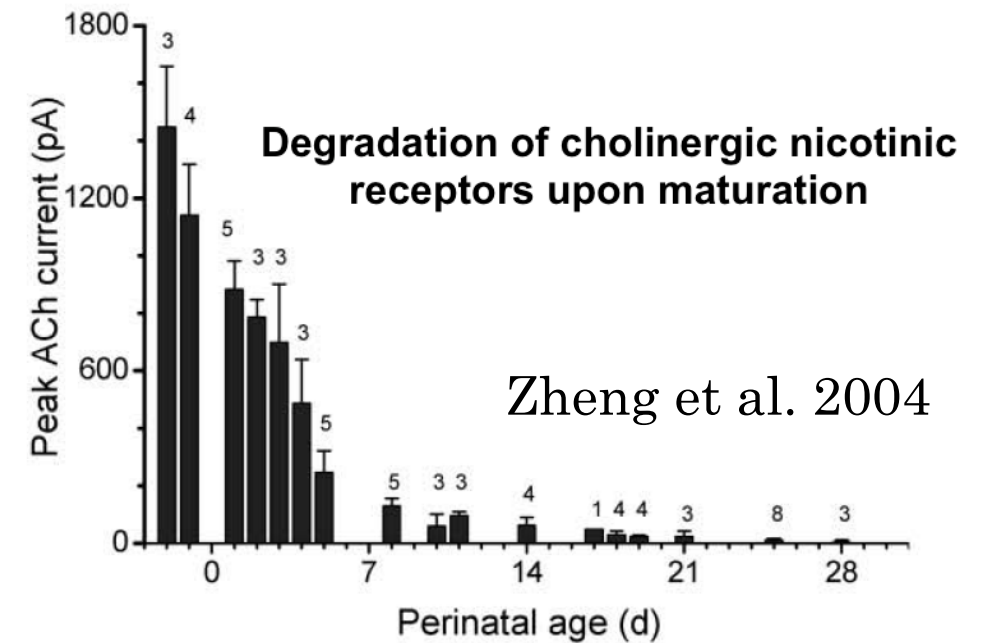


# Variability within retinal waves

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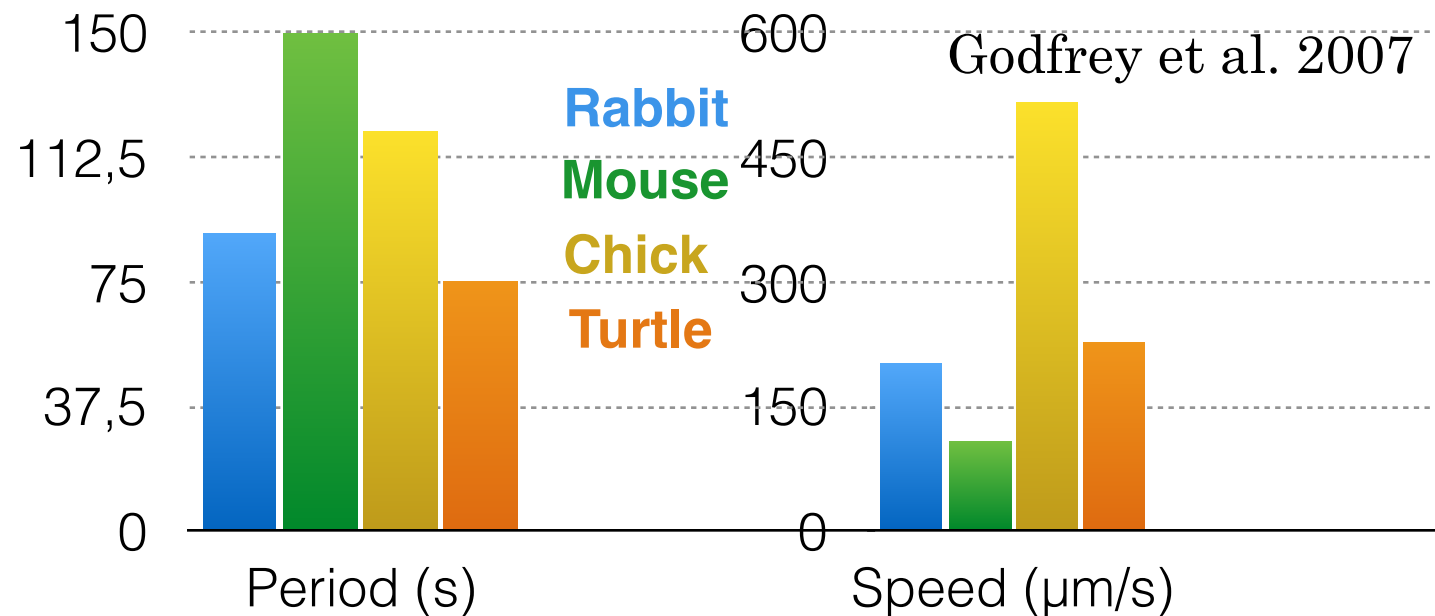


## ii) Development

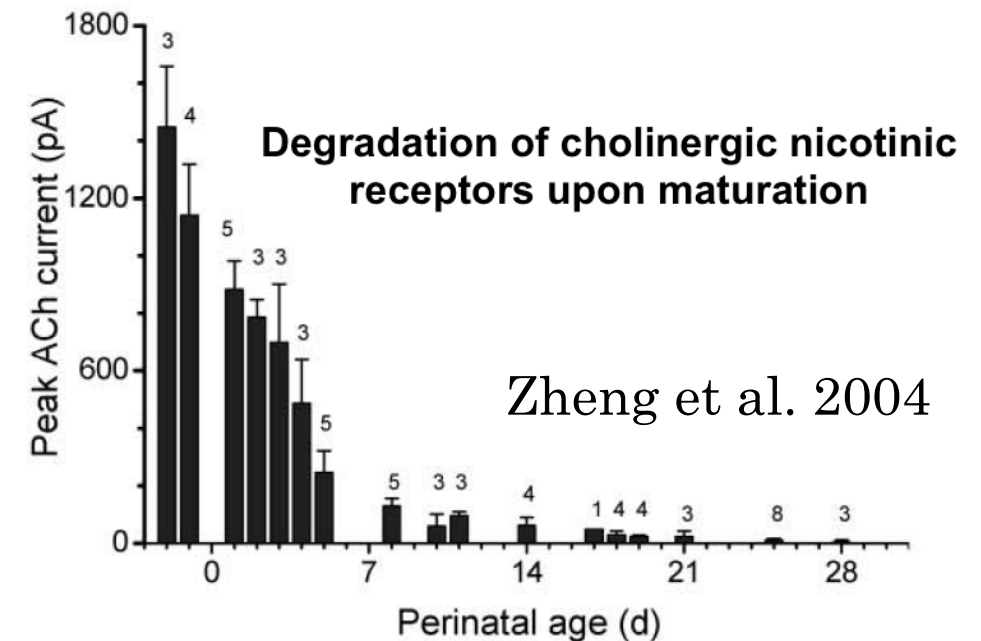


# Variability within retinal waves

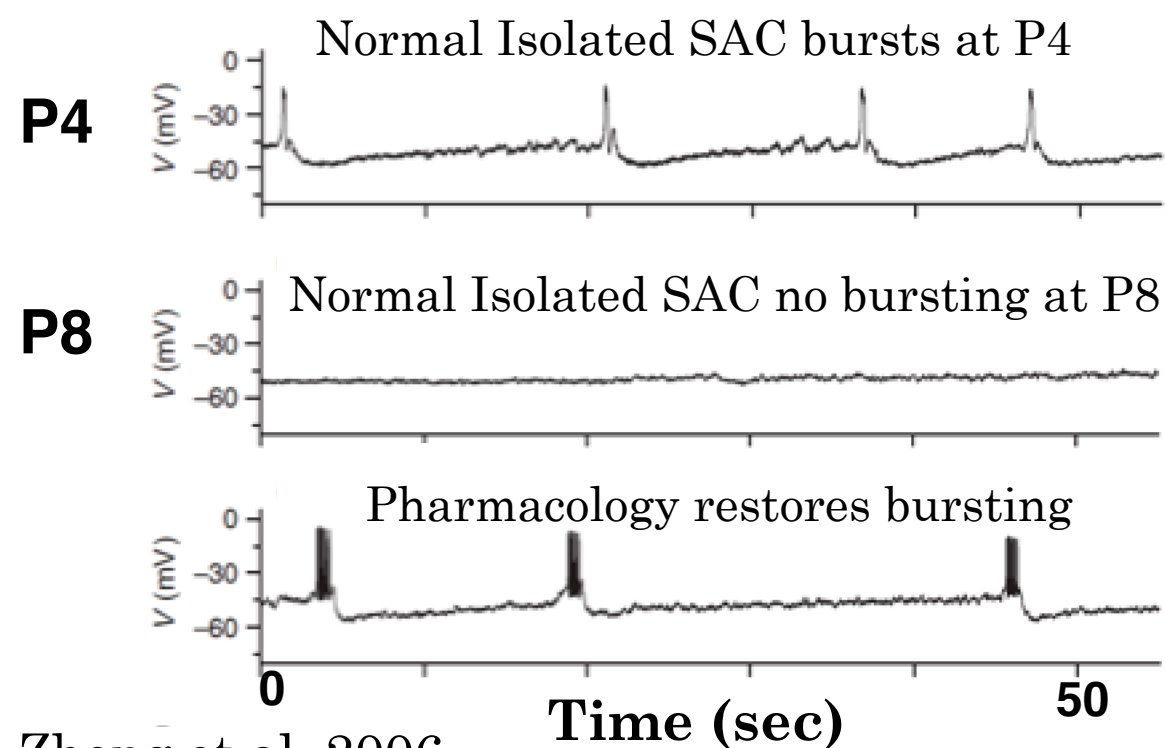
## i) Across species



## ii) Development



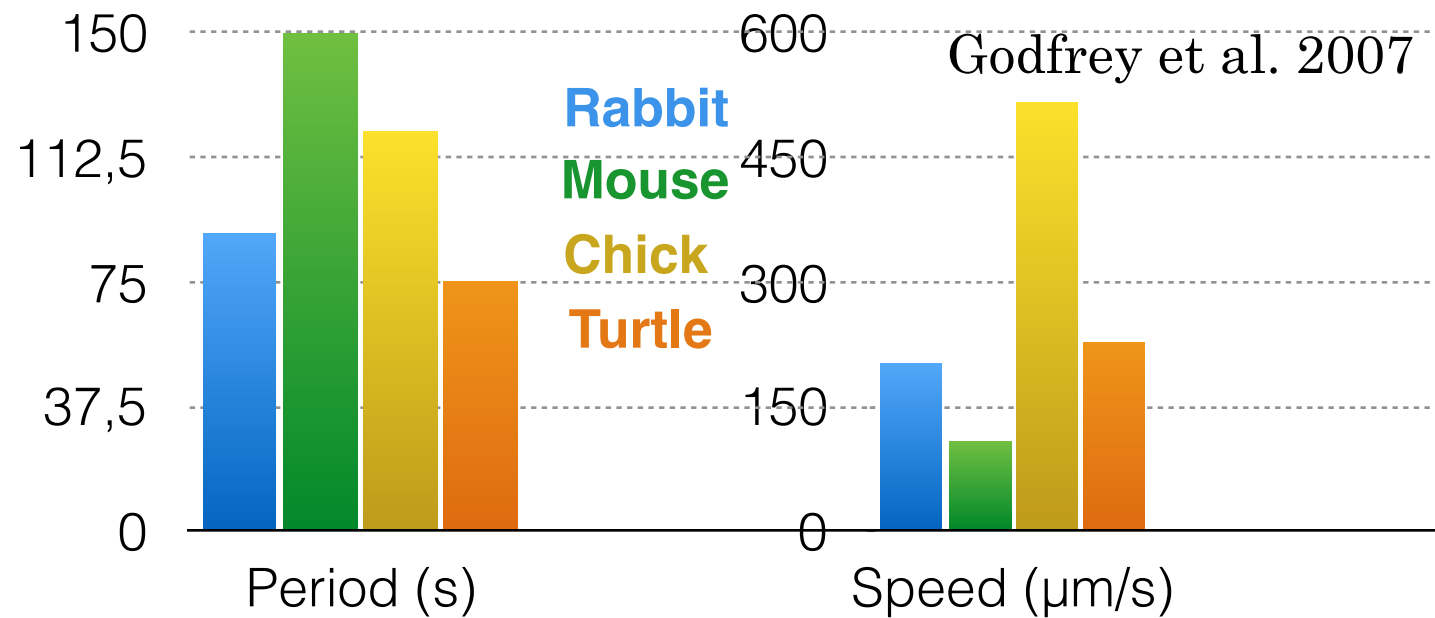
## iii) Pharmacology



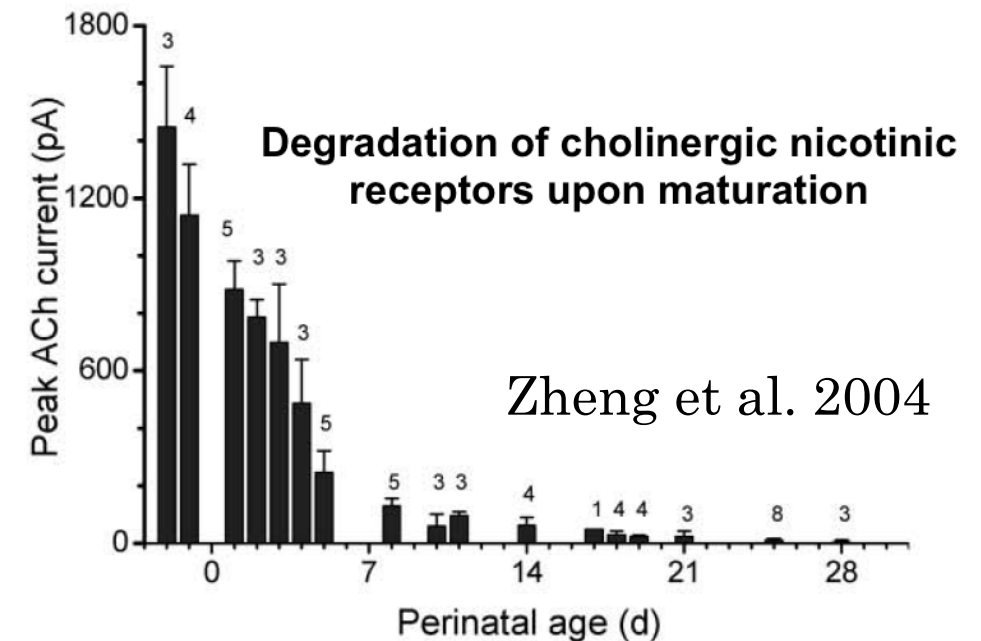
Zheng et al. 2006

# Variability within retinal waves

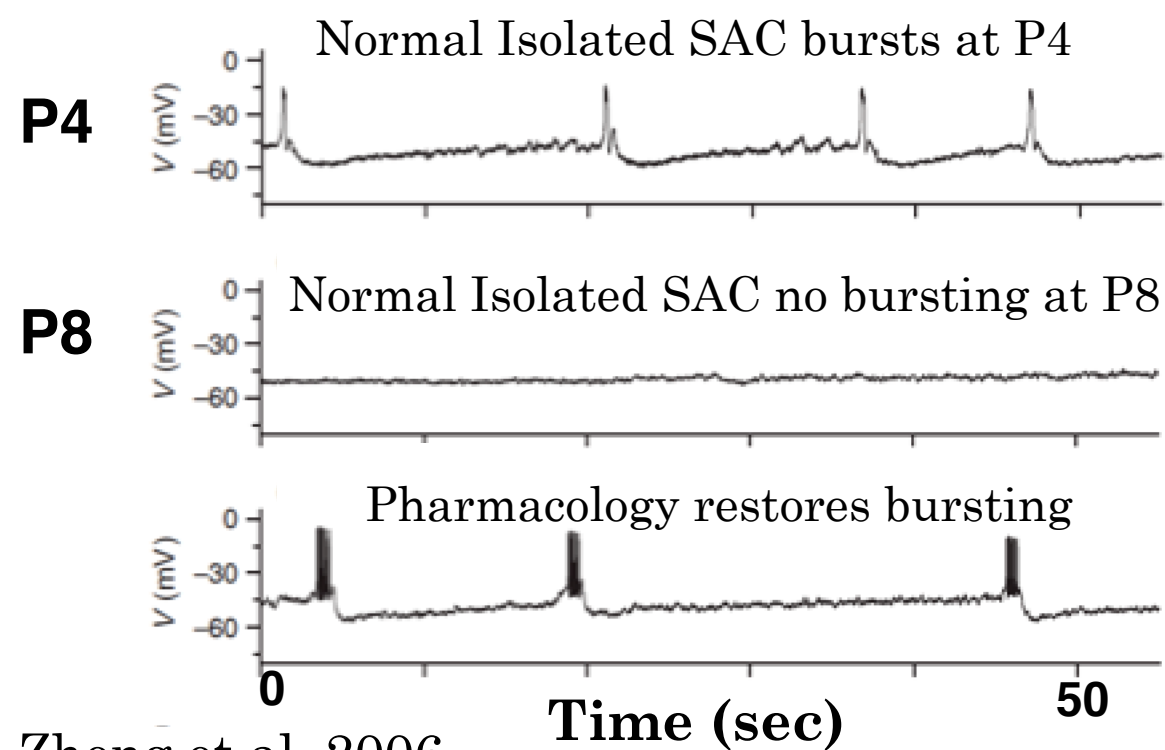
## i) Across species



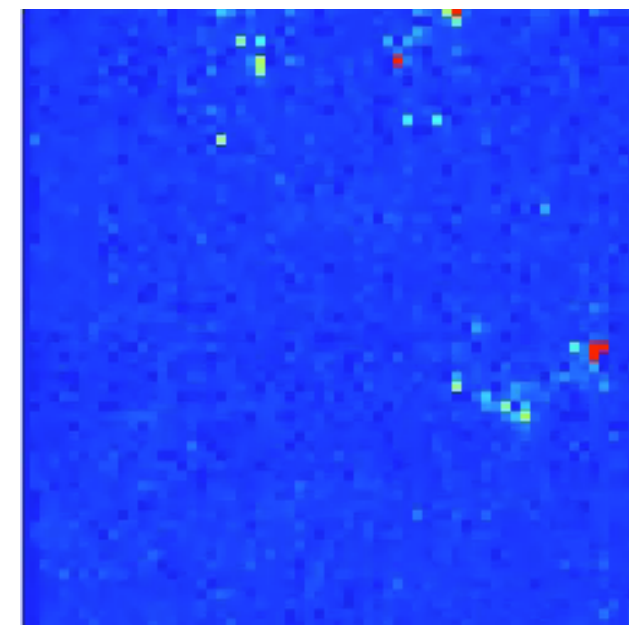
## ii) Development



## iii) Pharmacology



## iv) Spatial Variability



Waves have variable shapes due to a refractory mechanism which controls their borders.

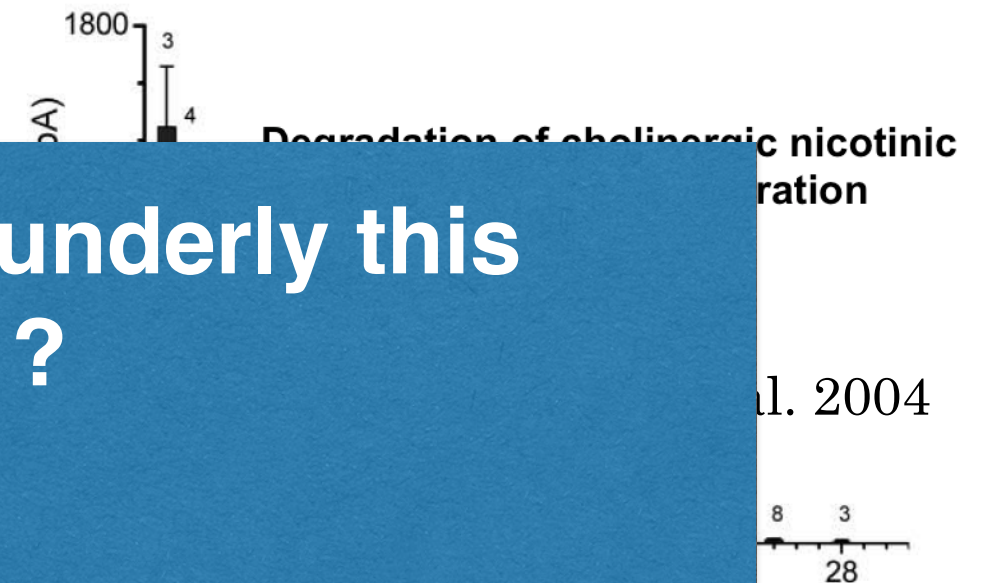
Maccione et al. 2014

# Variability within retinal waves

## i) Across species



## ii) Development



Which mechanisms underly this variability ?

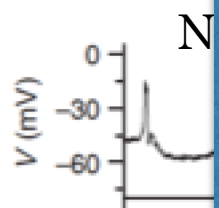
Randomness ?

Genetics ?

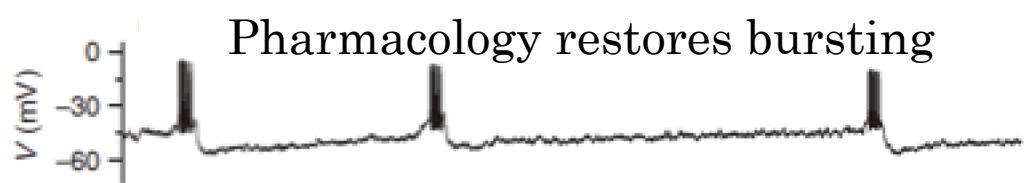
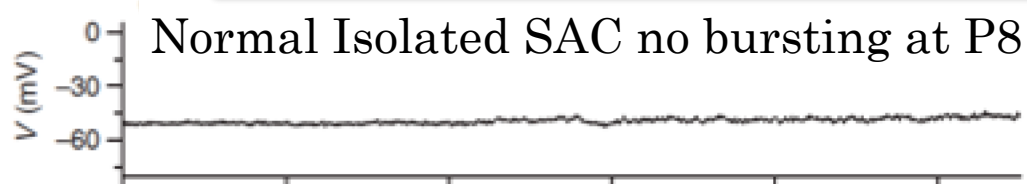
Non linear dynamics ?

## iii)

P4



P8

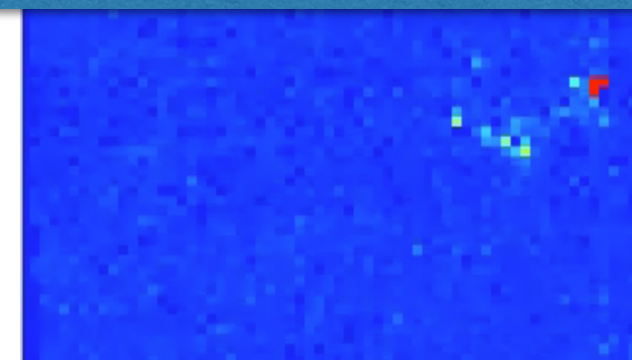


0

Time (sec)

50

Zheng et al. 2006



Maccione et al. 2014

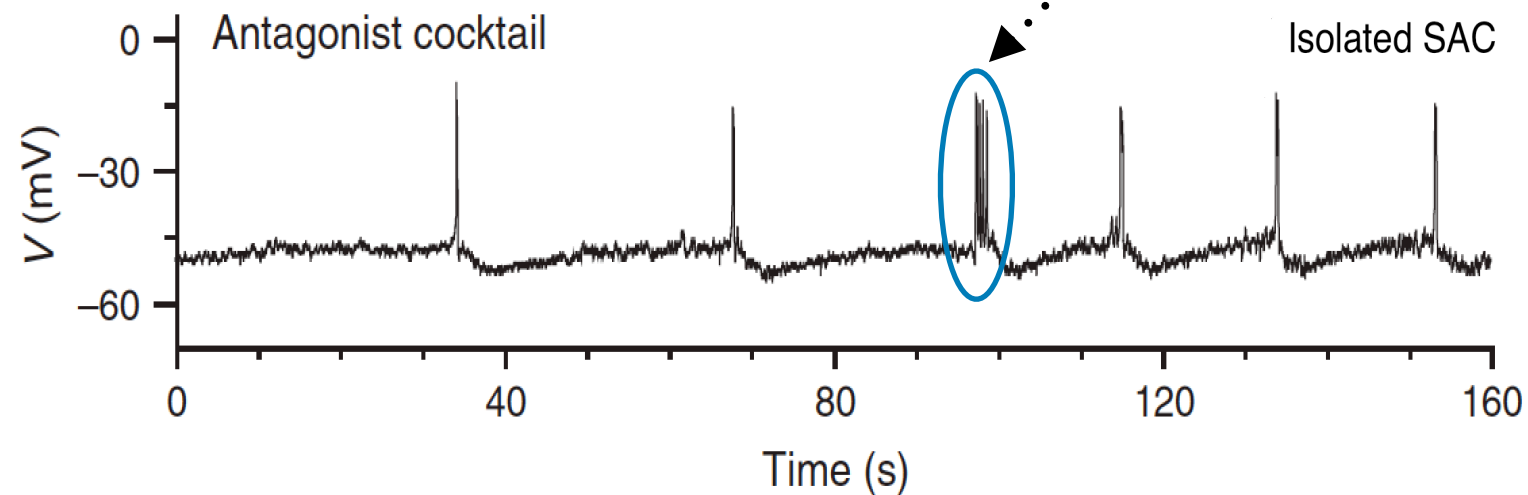
ability

have variable shapes due to a refractory mechanism which controls their borders.

# Cellular mechanisms of SACs bursting

# Cellular mechanisms of SACs bursting

## A. Spontaneous Fast oscillations



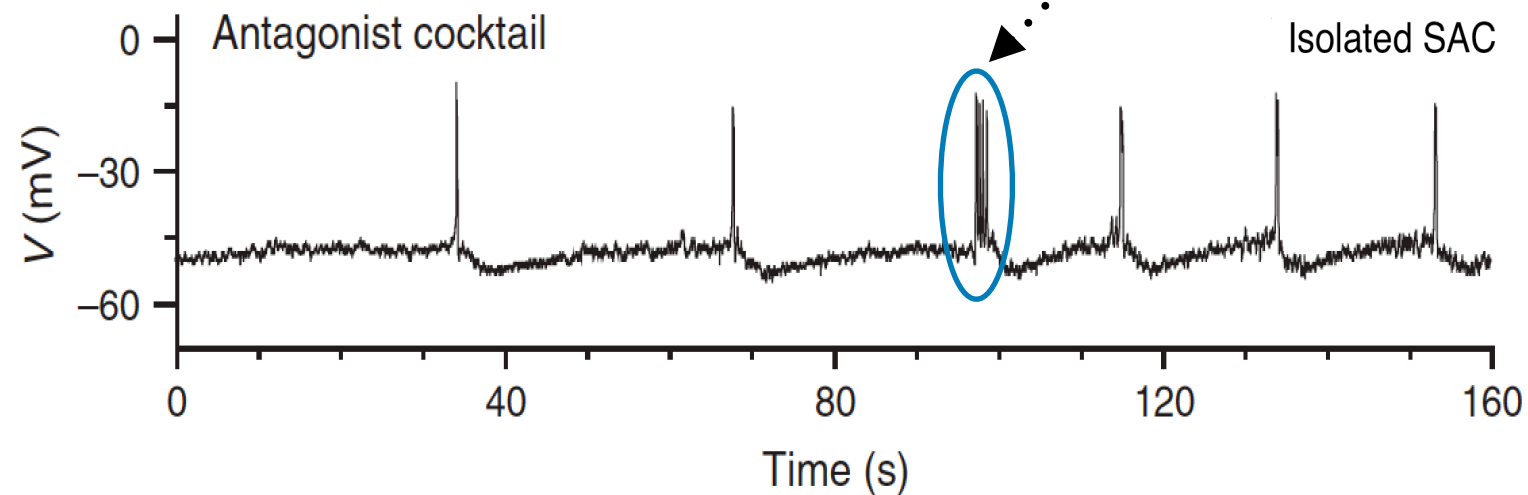
Generated mainly by  
fast voltage-gated  
 $\text{Ca}^{2+}$  channels

Zheng et al. 2006



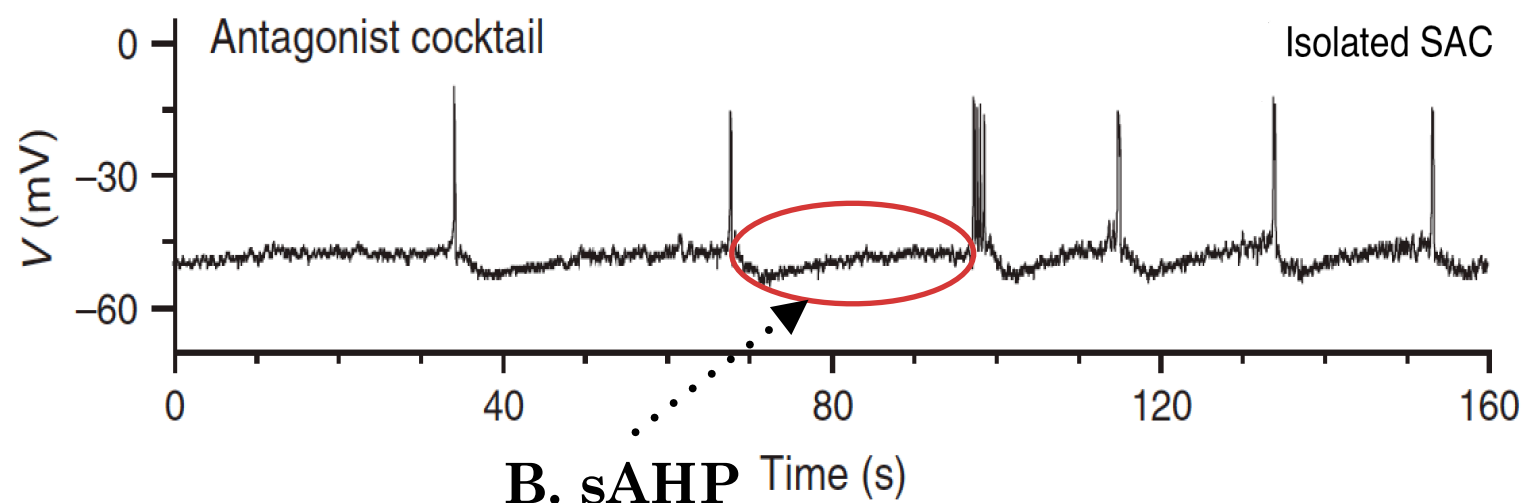
# Cellular mechanisms of SACs bursting

## A. Spontaneous Fast oscillations



Generated mainly by  
fast voltage-gated  
 $\text{Ca}^{2+}$  channels

Zheng et al. 2006



Generated mainly by  
slow  $\text{Ca}^{2+}$ -gated  $\text{K}^{+}$   
channels

Zheng et al. 2006

**B. sAHP**  
(slow AfterHyperpolarization)

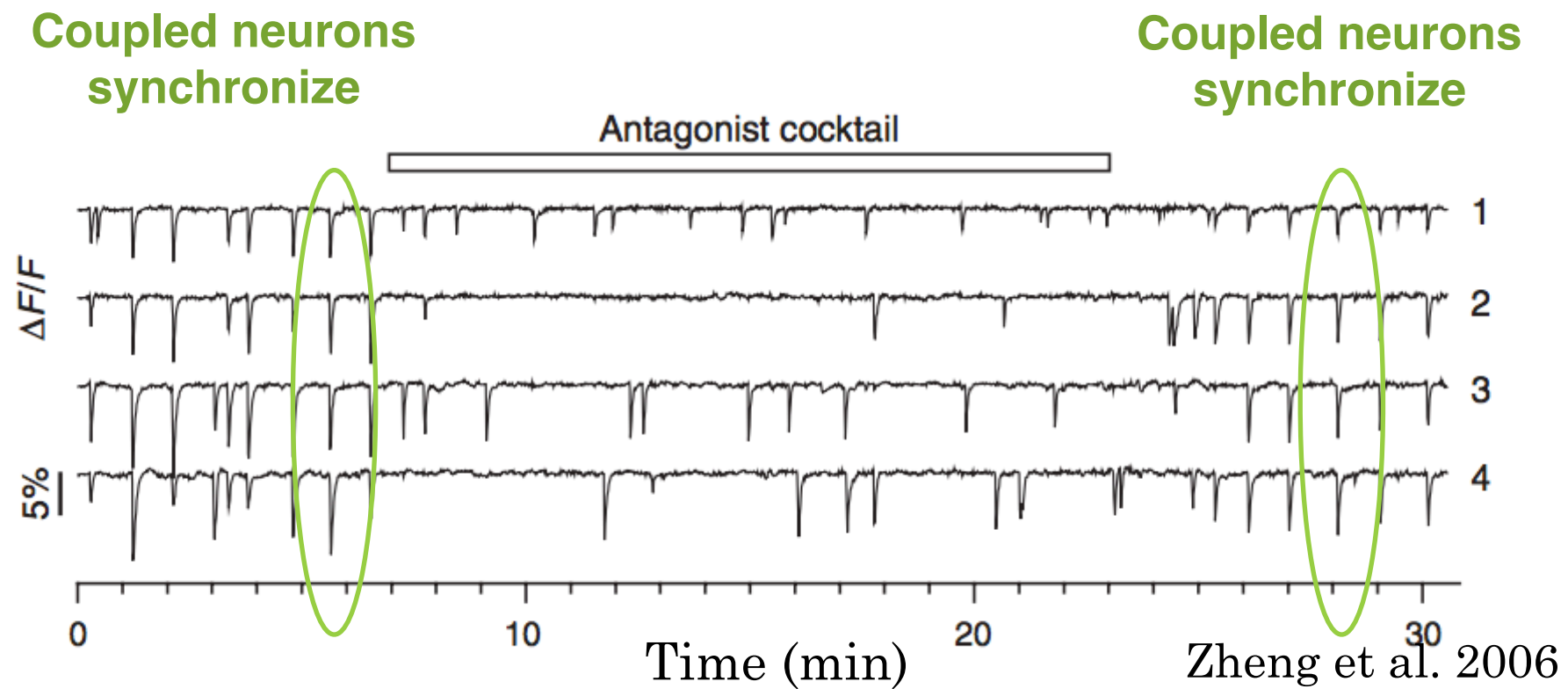
# Cellular mechanisms of stage II retinal waves

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## C. Synchrony through Acetylcholine

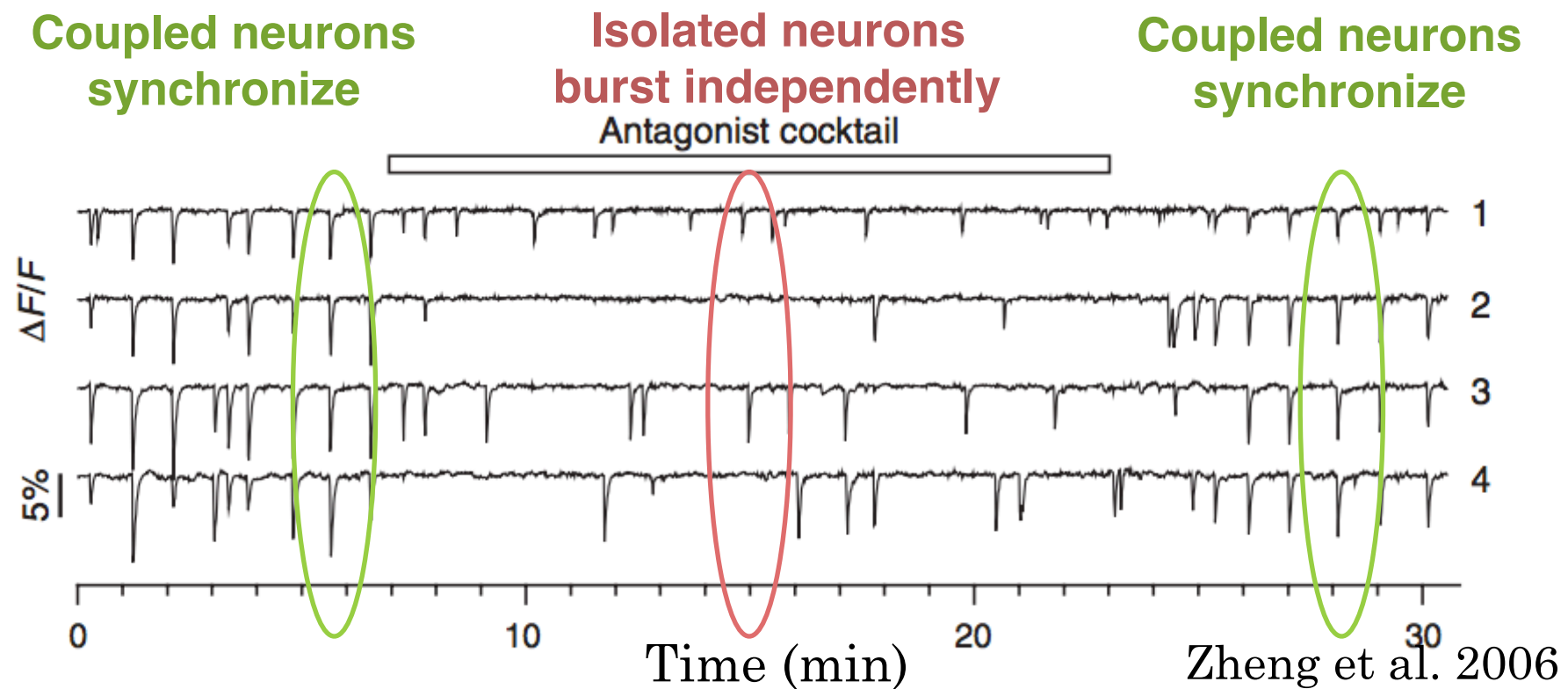
# Cellular mechanisms of stage II retinal waves

## C. Synchrony through Acetylcholine



# Cellular mechanisms of stage II retinal waves

## C. Synchrony through Acetylcholine



**Mutual excitatory  
connections between SACs through  
Acetylcholine**

# A network model for stage II retinal waves

$$\left\{ \begin{array}{lcl} C_m \frac{dV_i}{dt} & = & -g_L(V_i - V_L) - g_C M_\infty(V_i)(V_i - V_C) - g_K N_i(V_i - V_K) \\ & & - G_{sAHP}(R_i)(V_i - V_K) - G_A(\{A_k\}_{k \in \mathcal{B}_i})(V_i - V_A) \\ \tau_N \frac{dN_i}{dt} & = & \Lambda(V_i)(N_\infty(V_i) - N_i) \\ \tau_C \frac{dC_i}{dt} & = & -\frac{\alpha_C}{H_X} C_i + C_0 - \delta_C g_C M_\infty(V_i)(V_i - V_C) \\ \tau_S \frac{dS_i}{dt} & = & \alpha_S(1 - S_i)C_i^4 - S_i \\ \tau_R \frac{dR_i}{dt} & = & \alpha_R S_i(1 - R_i) - R_i \\ \frac{dA_i}{dt} & = & -\mu A_i + \beta_A T_A(V_i), \end{array} \right.$$

# A network model for stage II retinal waves

N neurons, 6 N equations

~ 20 parameters per neuron

**Tuned to match experimental records.**

$$\left\{ \begin{array}{l} C_m \frac{dV_i}{dt} = -g_L(V_i - V_L) - g_C M_\infty(V_i)(V_i - V_C) - g_K N_i(V_i - V_K) \\ \quad - G_{sAHP}(P_i)(V_i - V_K) - G_i(\{A_j\}_{j \in \mathcal{N}_i})(V_i - V_A) \\ \tau_N \frac{dN_i}{dt} = \Lambda(V_i)(N_\infty(V_i) - N_i) \\ \tau_C \frac{dC_i}{dt} = -\frac{\alpha_C}{H_X} C_i + C_0 - \delta_C g_C M_\infty(V_i)(V_i - V_C) \\ \tau_S \frac{dS_i}{dt} = \alpha_S(1 - S_i)C_i^4 - S_i \\ \tau_R \frac{dR_i}{dt} = \alpha_R S_i(1 - R_i) - R_i \\ \frac{dA_i}{dt} = -\mu A_i + \beta_A T_A(V_i), \end{array} \right.$$

# A network model for stage II retinal waves

N neurons, 6 N equations

~20 parameters per neuron

Tuned to match experimental records.

Time scale separation

**Fast**  $V, N$ .  $\tau_L = 11$  ms,  $\tau_N = 5$  ms.

**Medium**  $C, A$ .  $\tau_C = 2$  s,  $\tau_A = 1.86$  s.

**Slow**  $S, R$ .  $\tau_R = \tau_S = 44$  s.



# A network model for stage II retinal waves

$$\left\{ \begin{array}{lcl} C_m \frac{dV_i}{dt} & = & -g_L(V_i - V_L) - g_C M_\infty(V_i)(V_i - V_C) - g_K N_i(V_i - V_K) \\ & & - G_{sAHP}(R_i)(V_i - V_K) - G_A(\{A_k\}_{k \in \mathcal{B}_i})(V_i - V_A) \\ \tau_N \frac{dN_i}{dt} & = & \Lambda(V_i)(N_\infty(V_i) - N_i) \\ \tau_C \frac{dC_i}{dt} & = & -\frac{\alpha_C}{H_X} C_i + C_0 - \delta_C g_C M_\infty(V_i)(V_i - V_C) \\ \tau_S \frac{dS_i}{dt} & = & \alpha_S(1 - S_i)C_i^4 - S_i \\ \tau_R \frac{dR_i}{dt} & = & \alpha_R S_i(1 - R_i) - R_i \\ \frac{dA_i}{dt} & = & -\mu A_i + \beta_A T_A(V_i), \end{array} \right.$$

# A network model for stage II retinal waves

$$C_m \frac{dV_i}{dt} = -g_L(V_i - V_L) - g_C M_\infty(V_i)(V_i - V_C) - g_K N_i(V_i - V_K) \\ - G_{SAHP}(R_i)(V_i - V_K) - G_A(\{A_k\}_{k \in \mathcal{B}_i})(V_i - V_A) \\ + I(R_i, A_j)$$

$$\tau_N \frac{dN_i}{dt} = \Lambda(V_i)(N_\infty(V_i) - N_i)$$

$$\tau_C \frac{dC_i}{dt} = -\frac{\alpha_C}{H_X} C_i + C_0 - \delta_C g_C M_\infty(V_i)(V_i - V_C)$$

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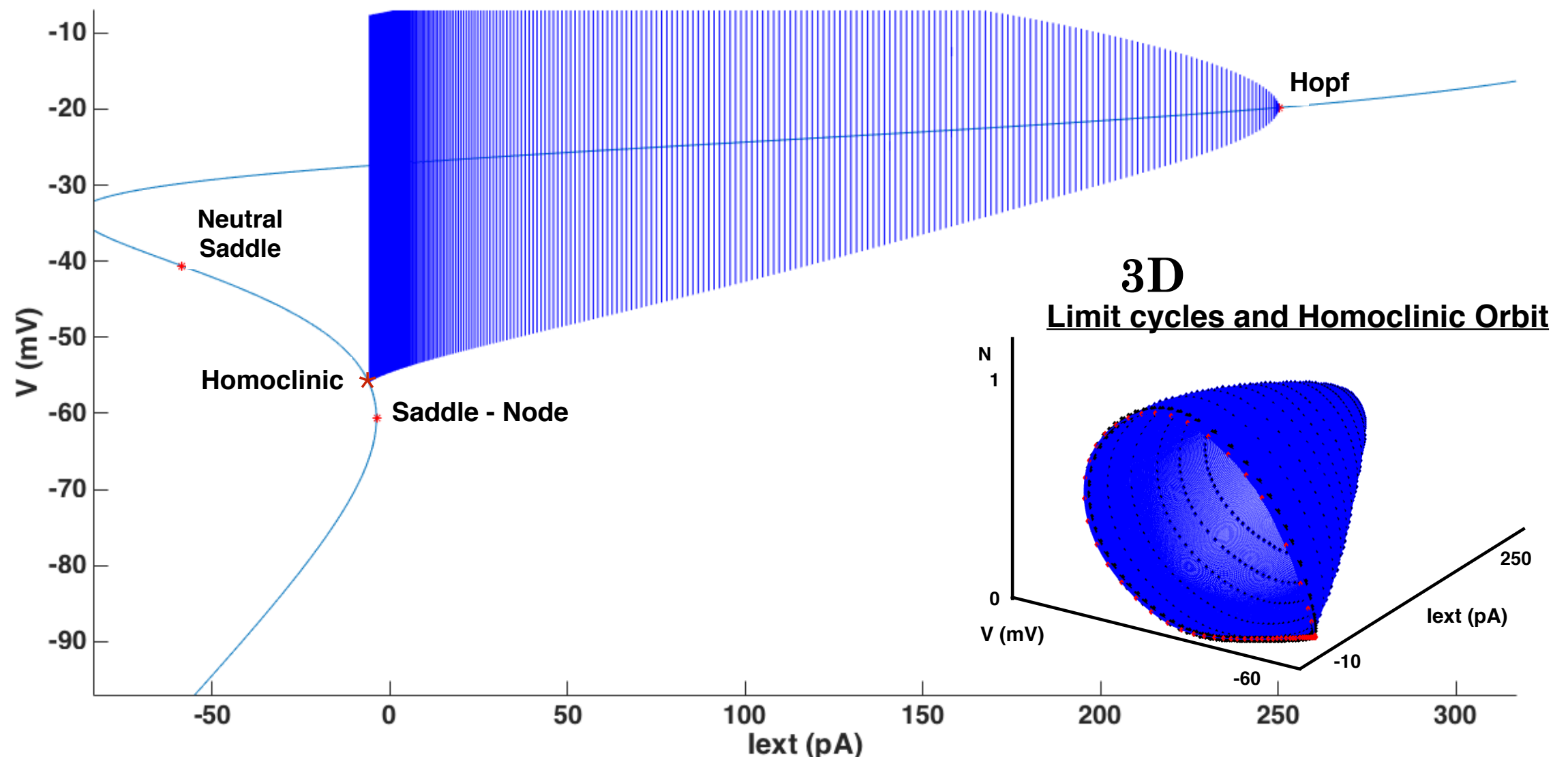
$$\tau_R \frac{dR_i}{dt} = \alpha_R S_i(1 - R_i) - R_i$$

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# Bifurcation diagram of the fast subsystem (V,N)

What do we learn about SACs?

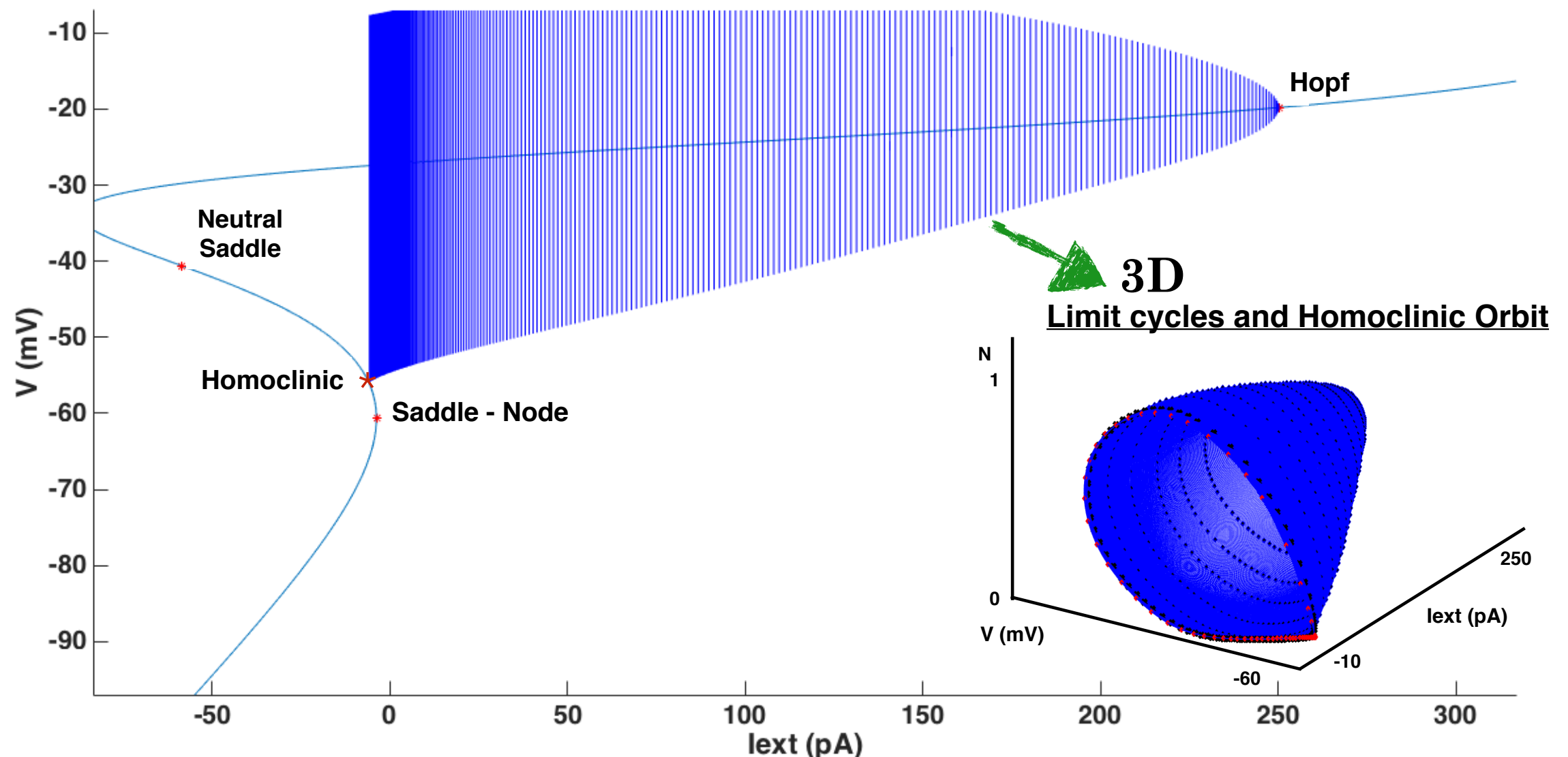
## I. The SACs repertoire of dynamics upon a varying current



# Bifurcation diagram of the fast subsystem (V,N)

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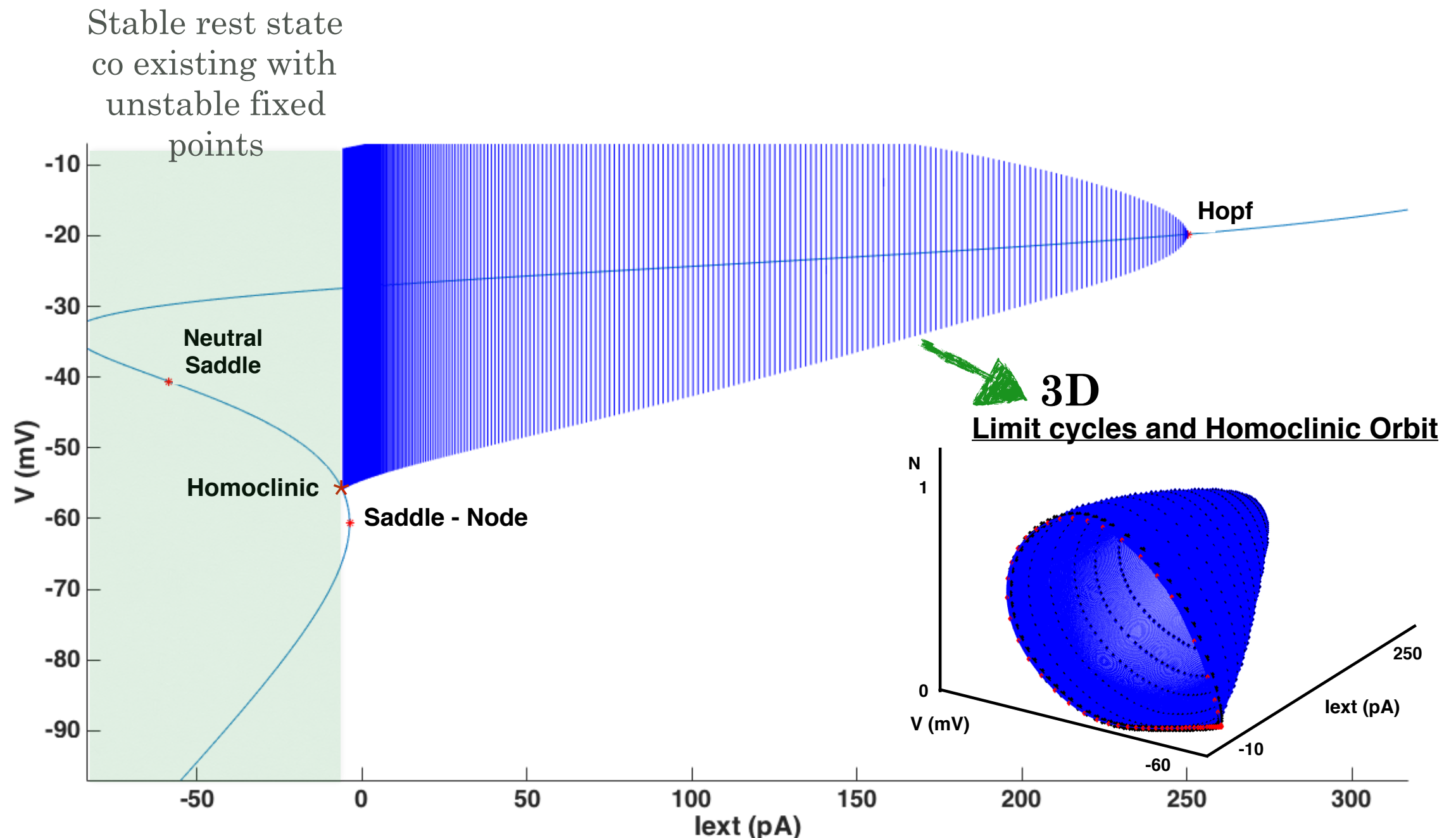
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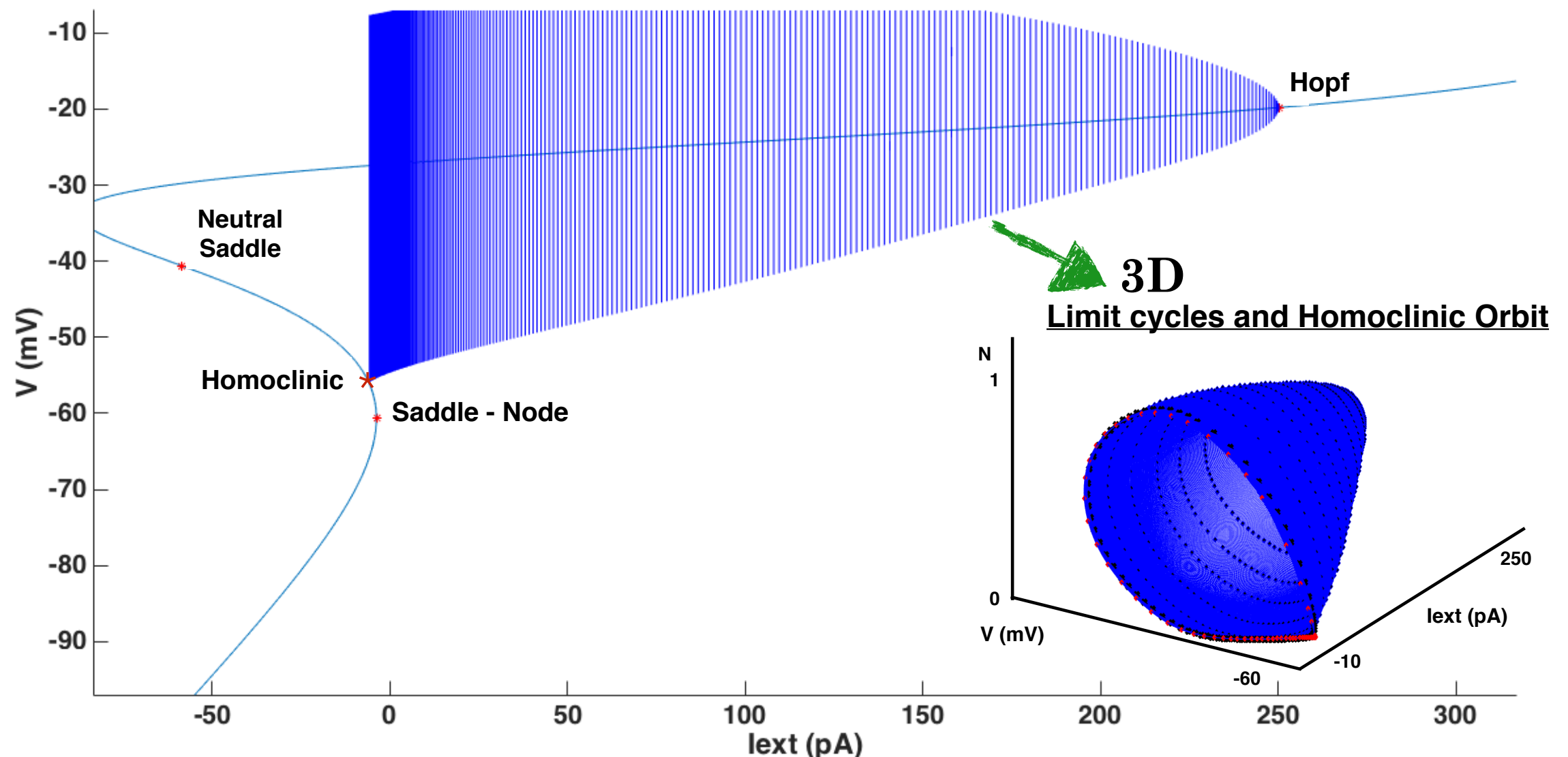
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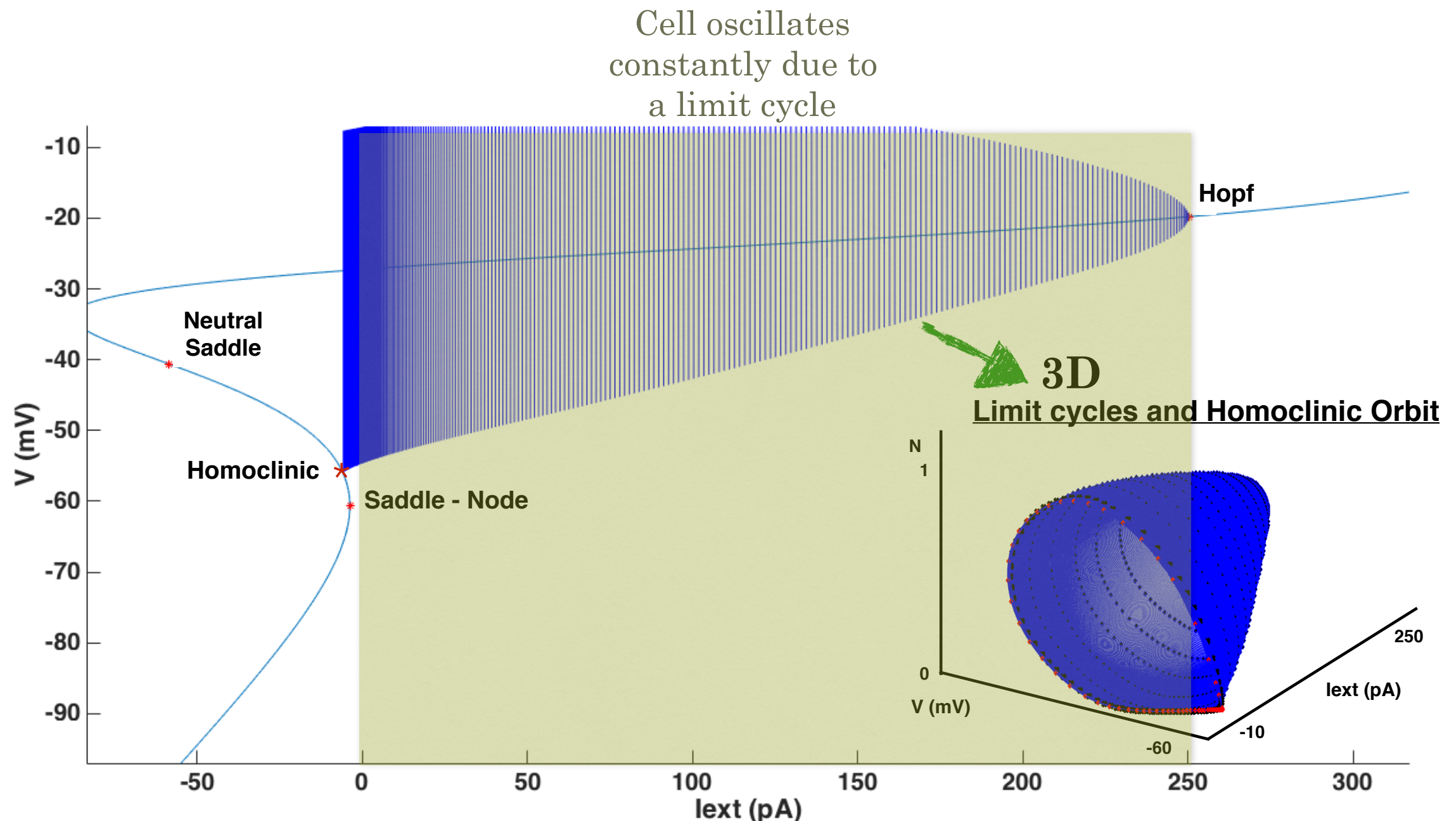




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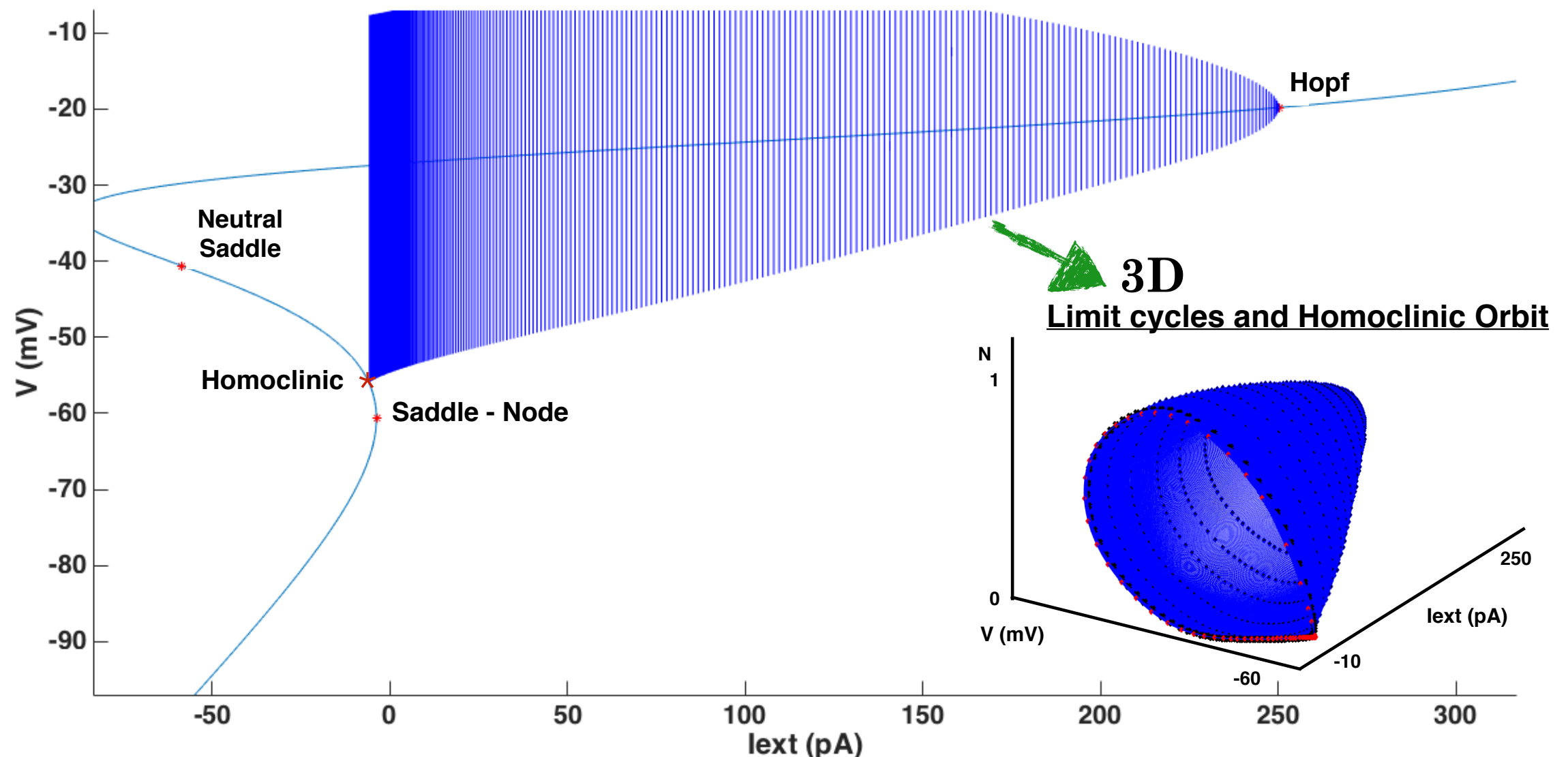
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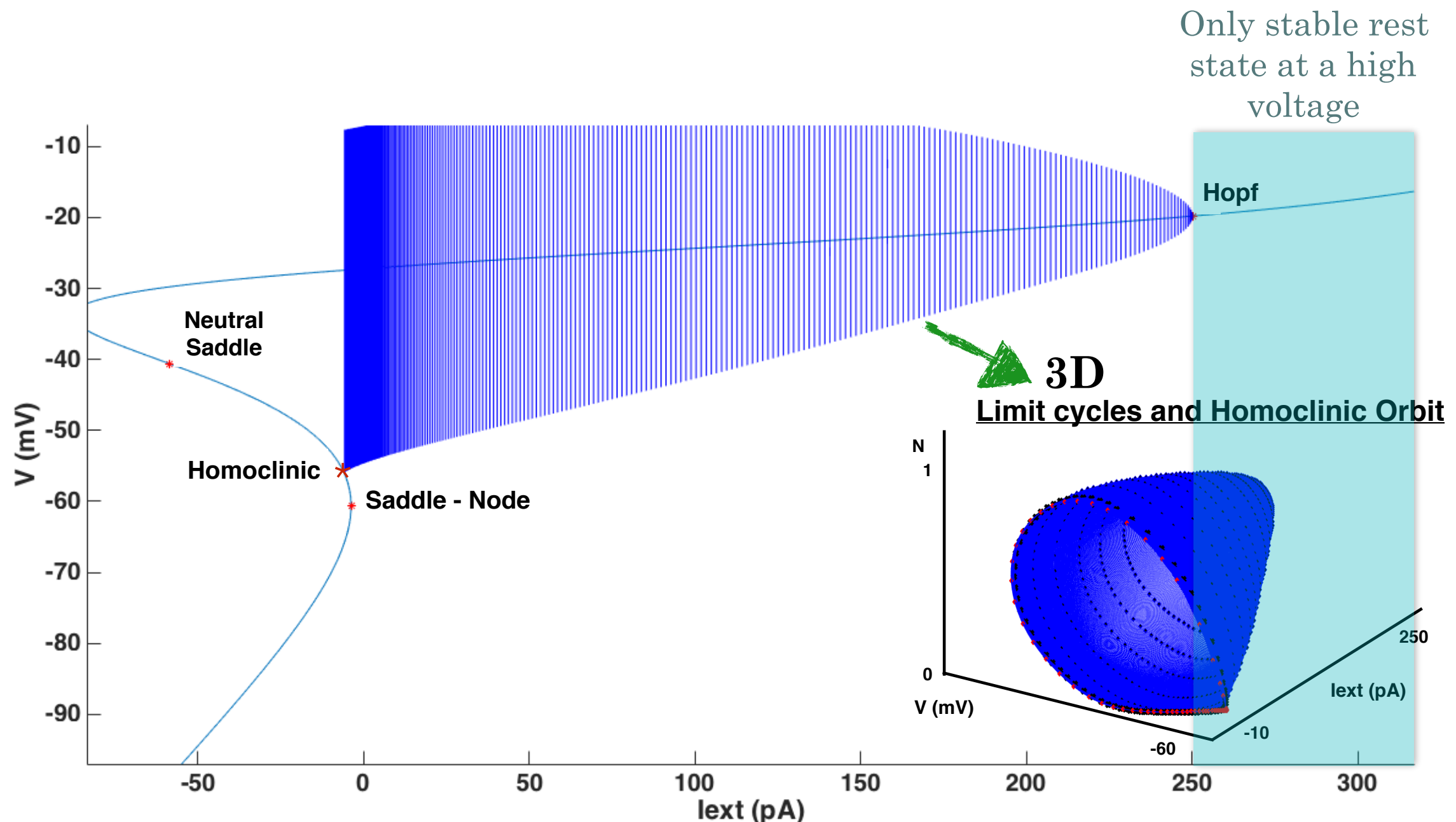




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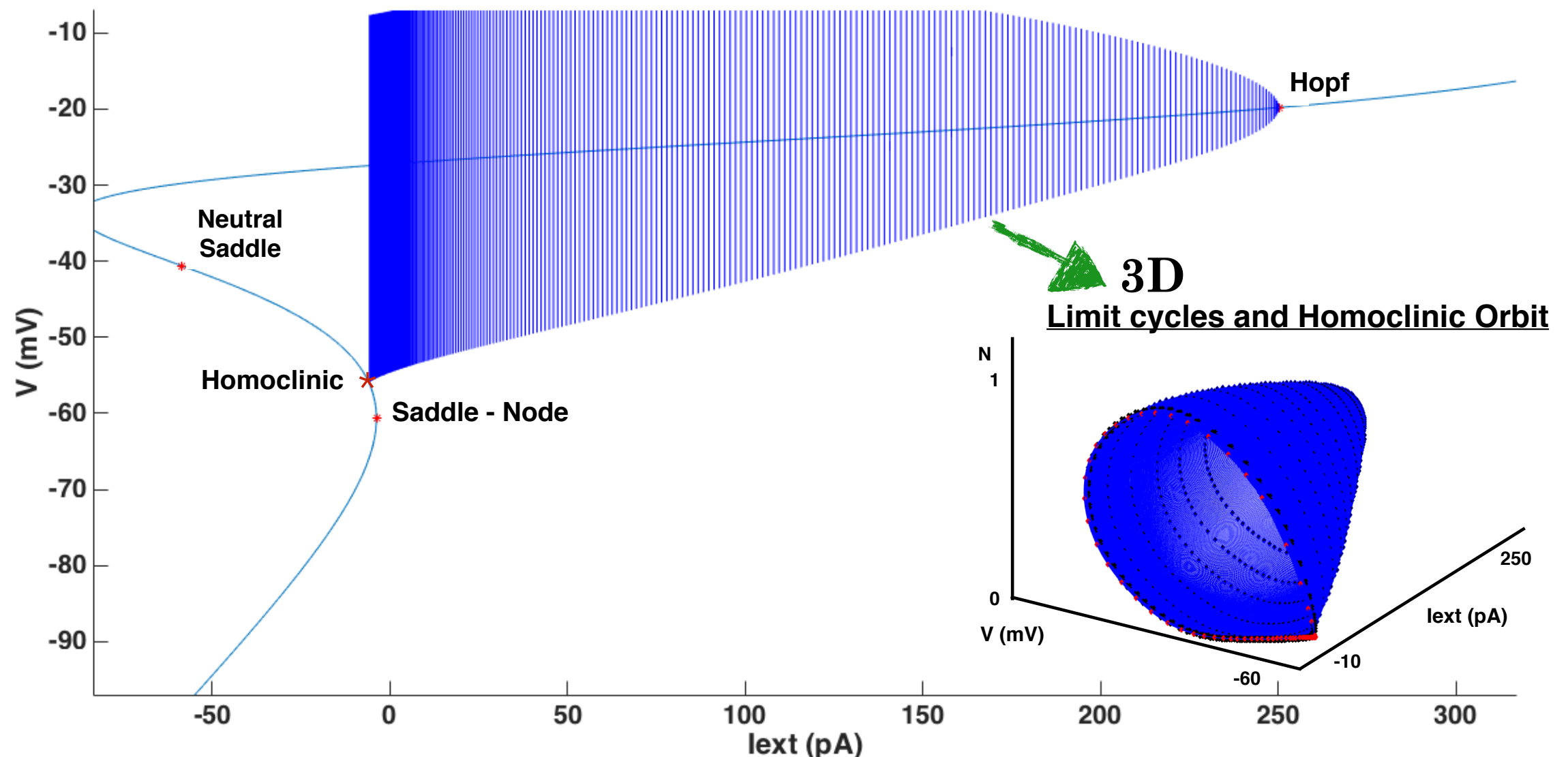
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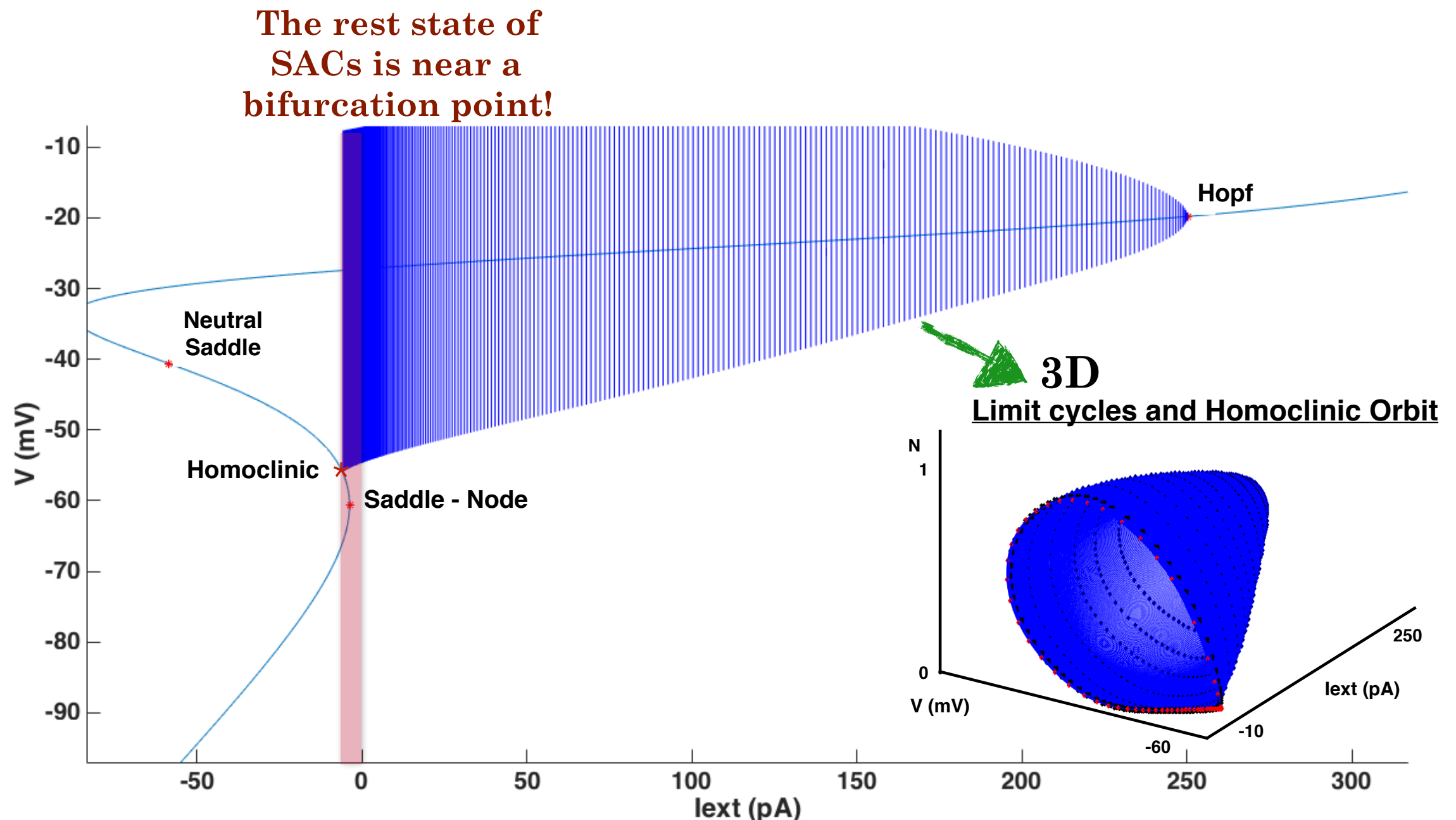
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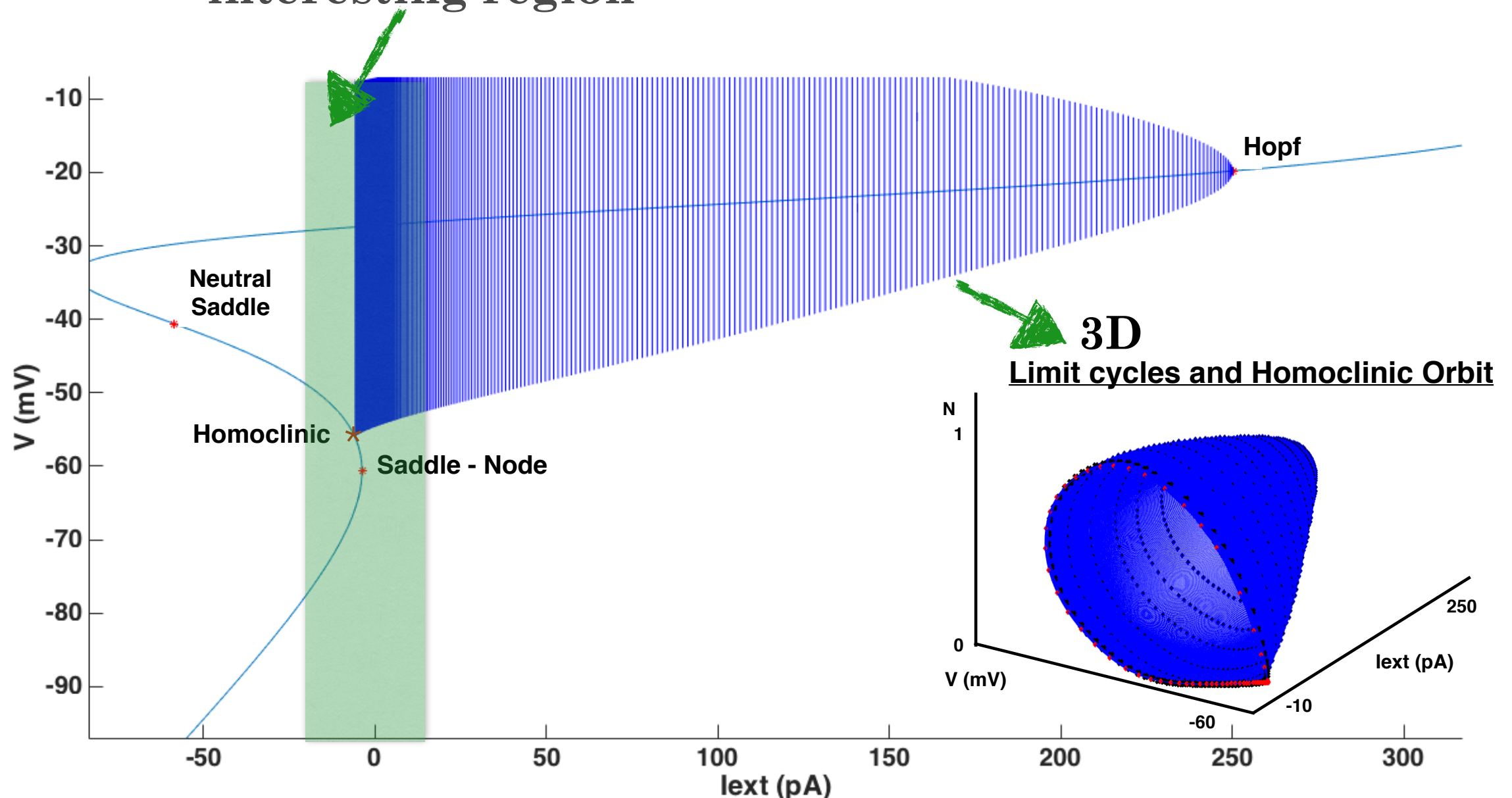


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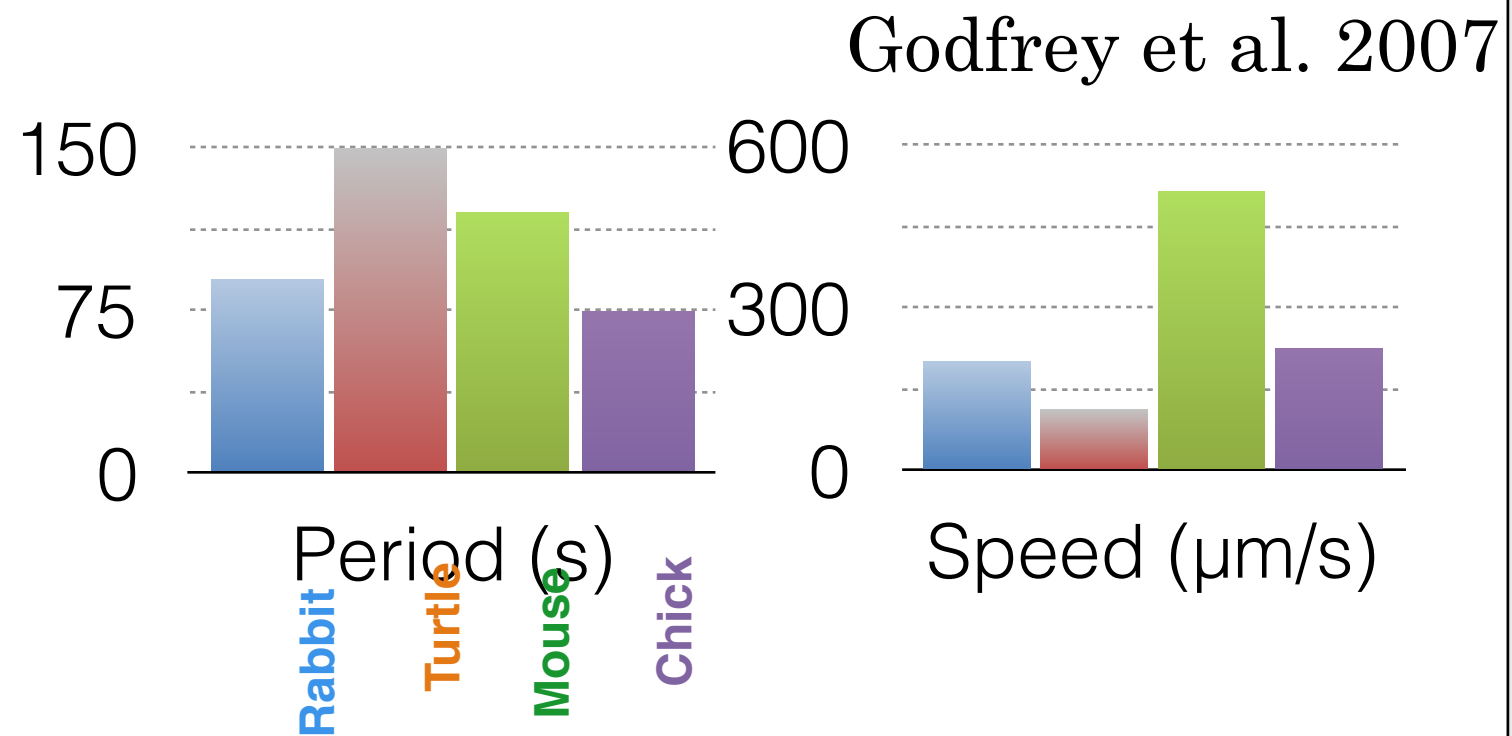
## I. The SACs repertoire of dynamics upon a varying current

Zoom in this  
interesting region



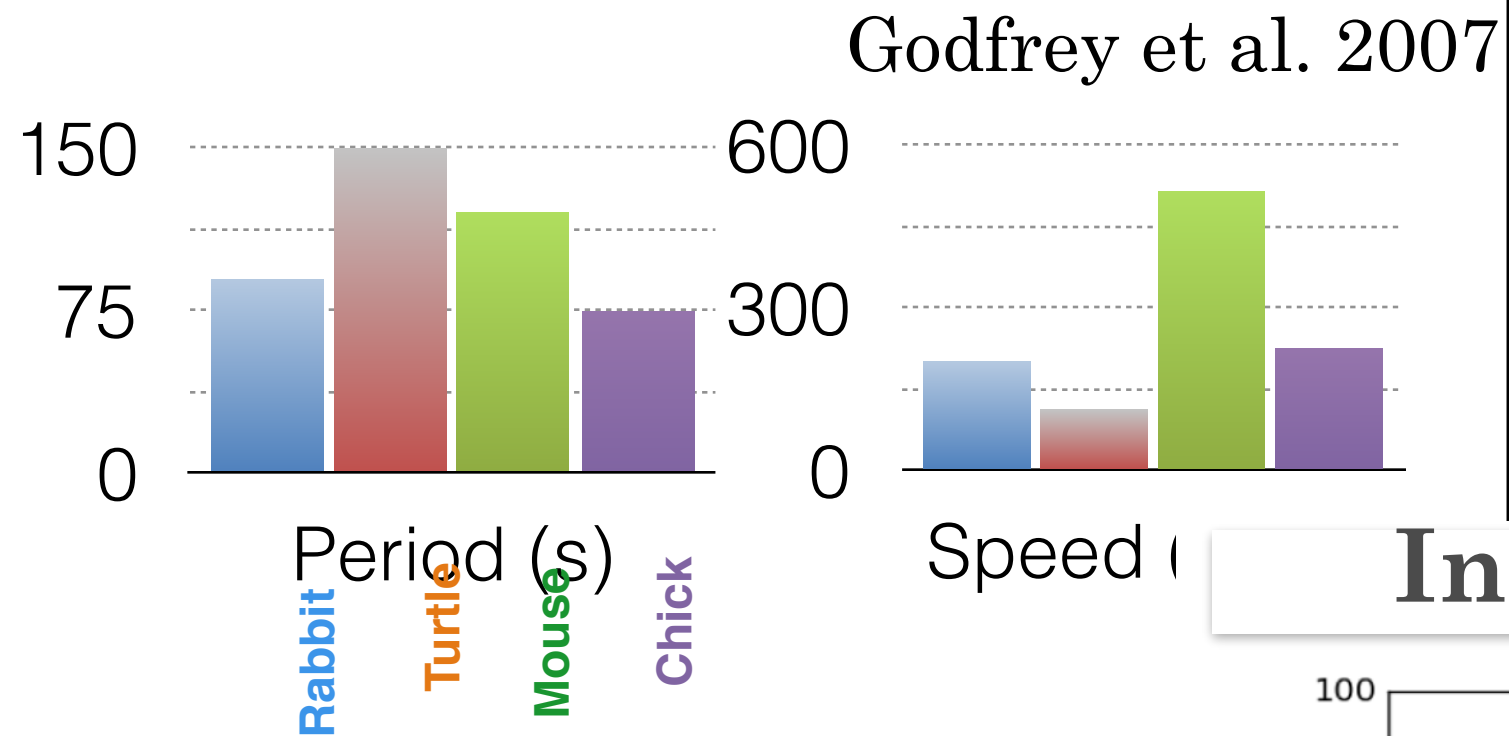
# Variability within retinal waves

## i) Across species

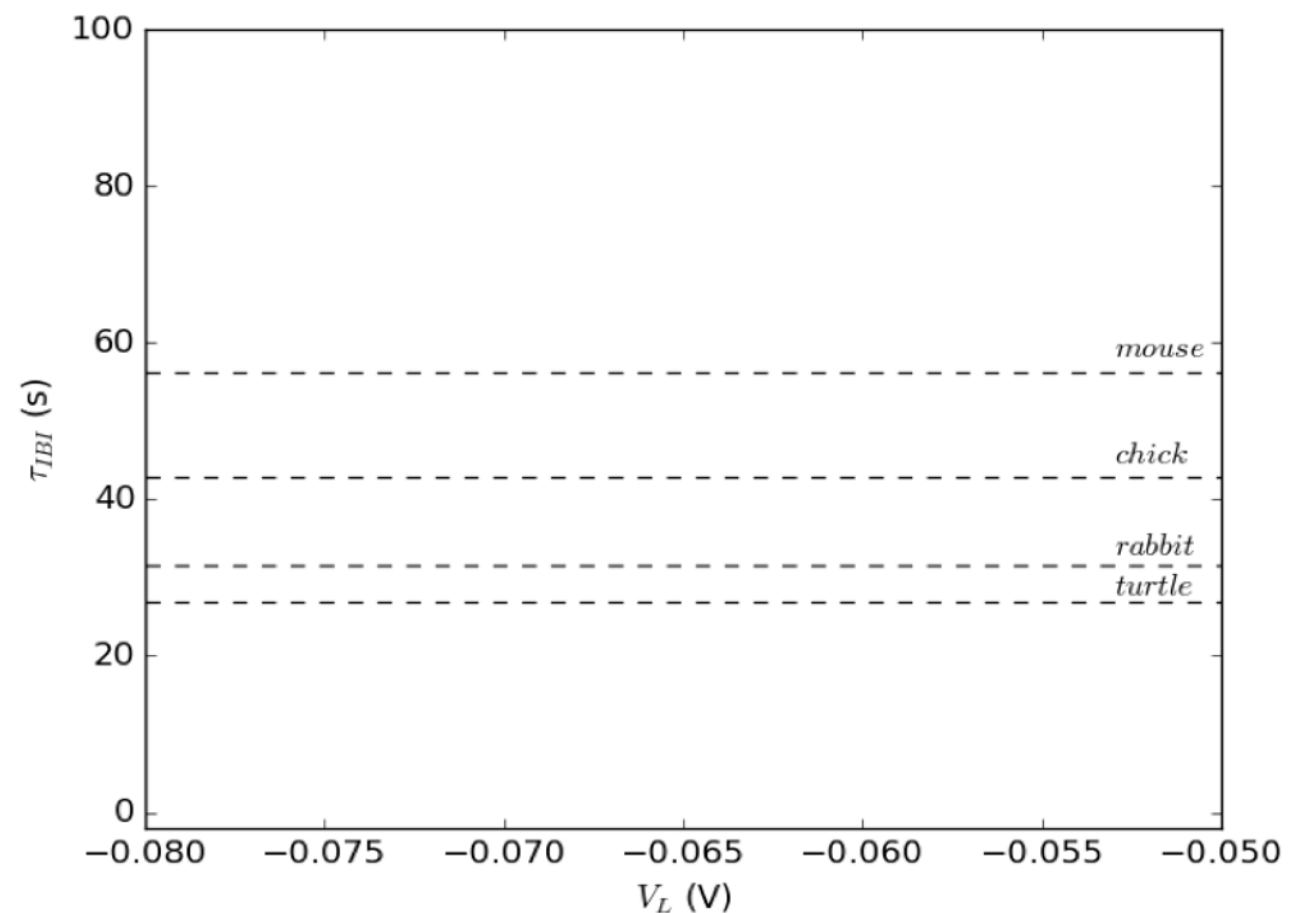


# Variability within retinal waves

## i) Across species



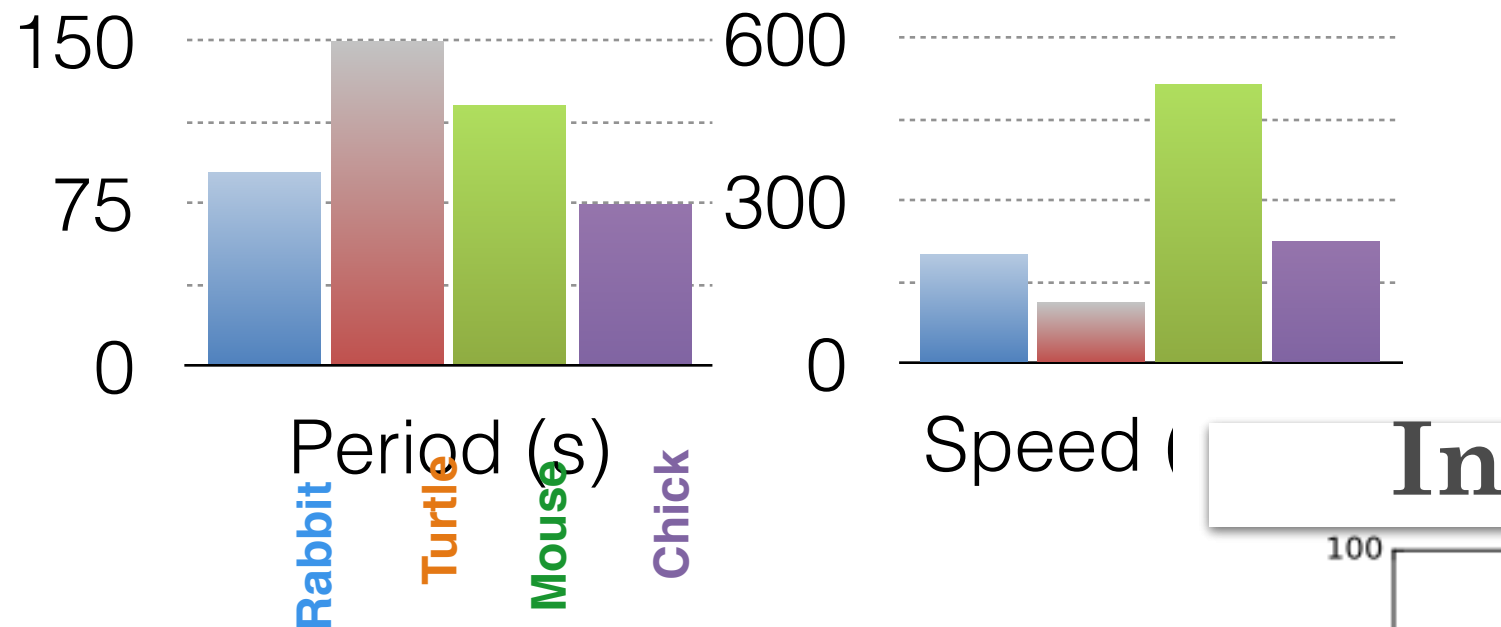
## Interburst intervals



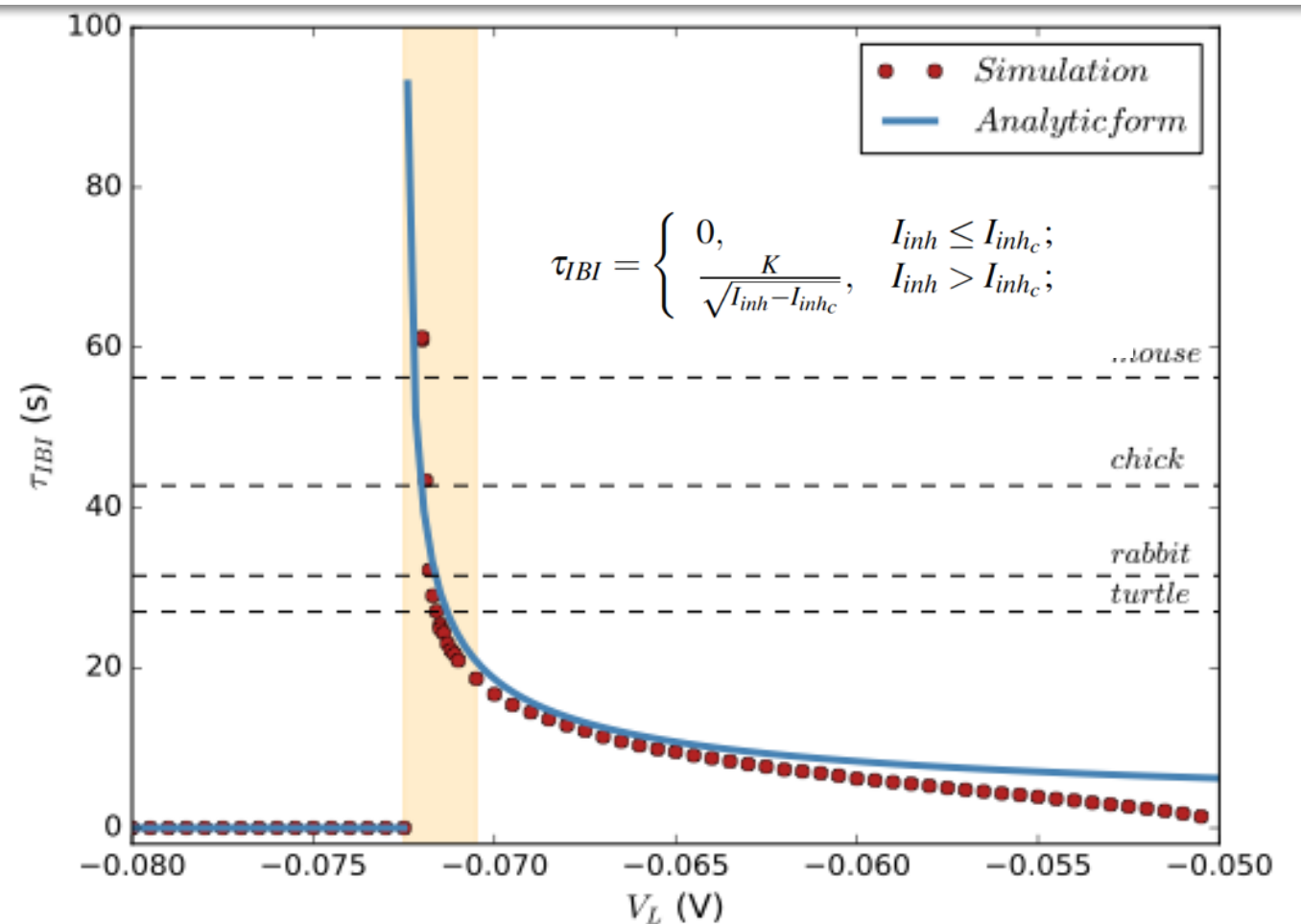
# Variability within retinal waves

## i) Across species

Godfrey et al. 2007



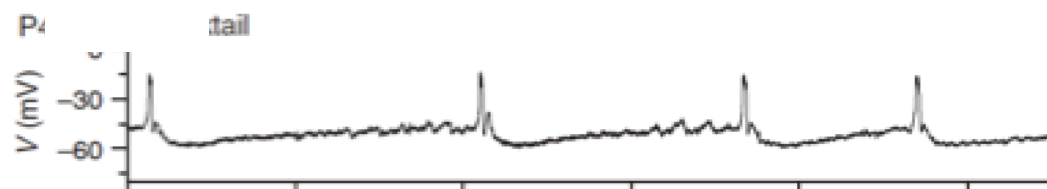
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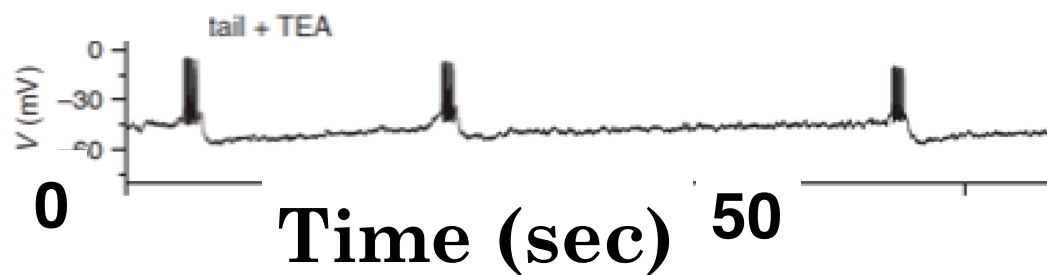
# Variability within retinal waves

## iii) Pharmacology

**P4**



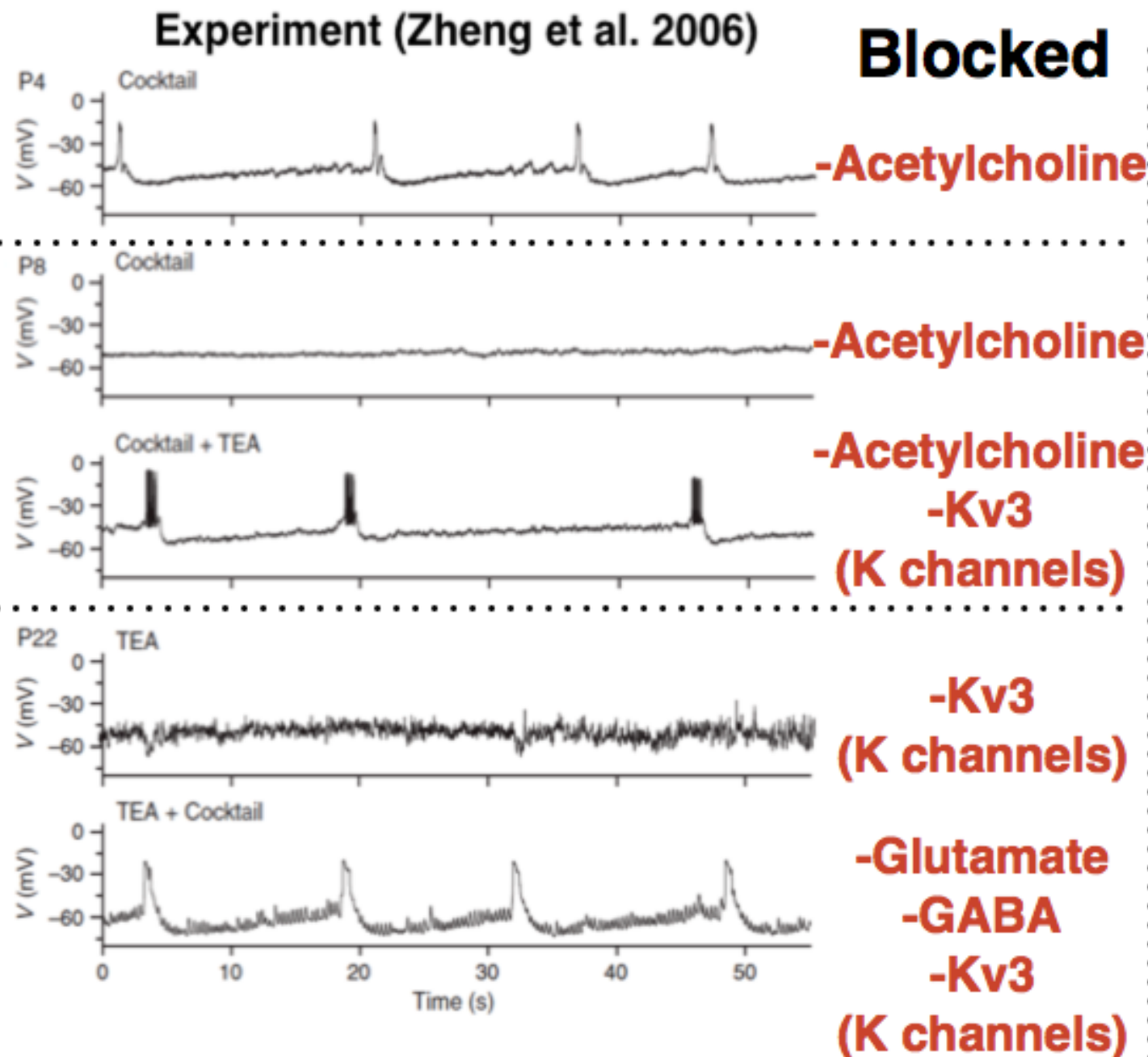
**P8**





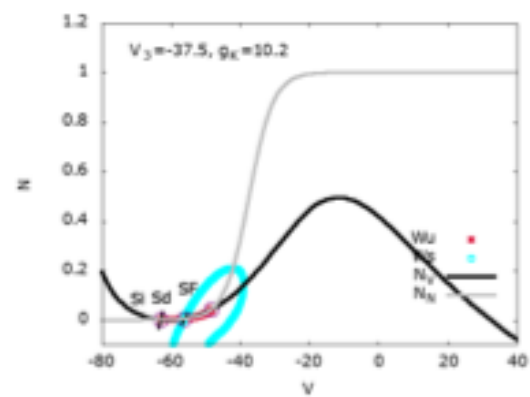
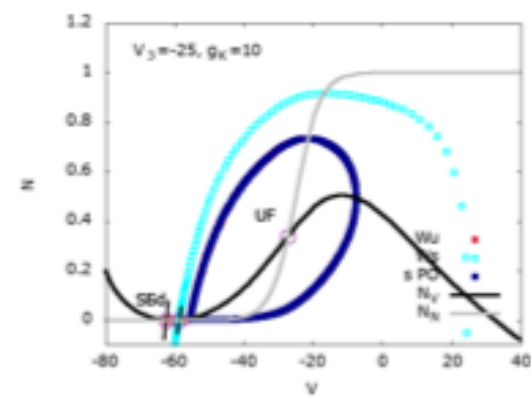
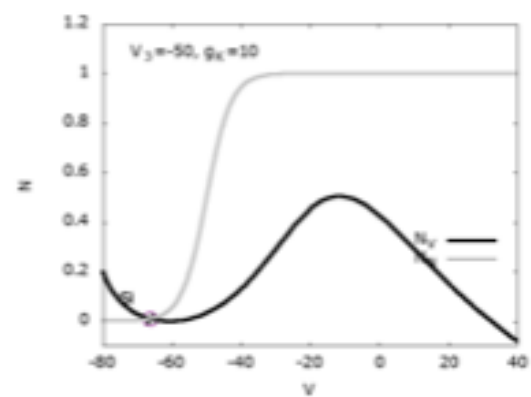
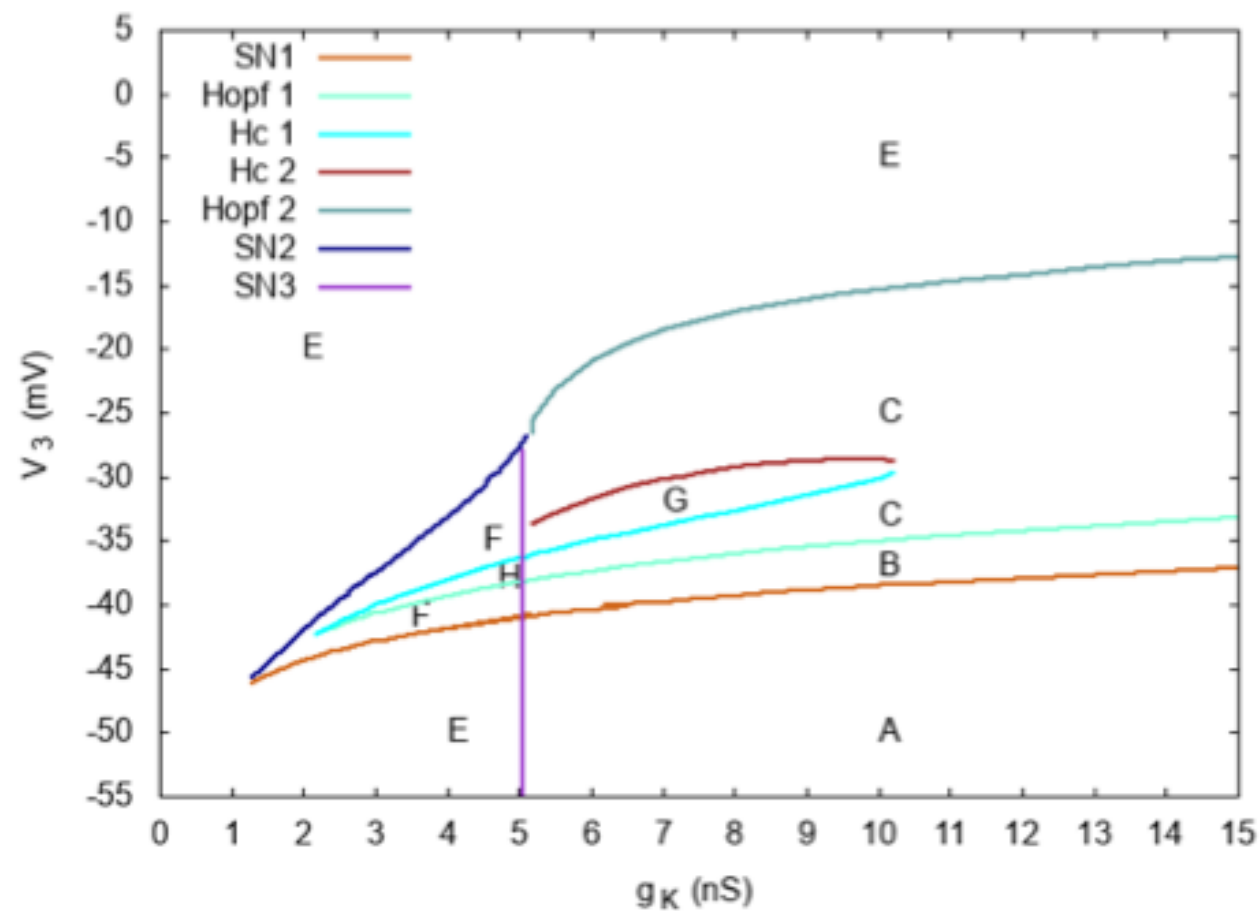
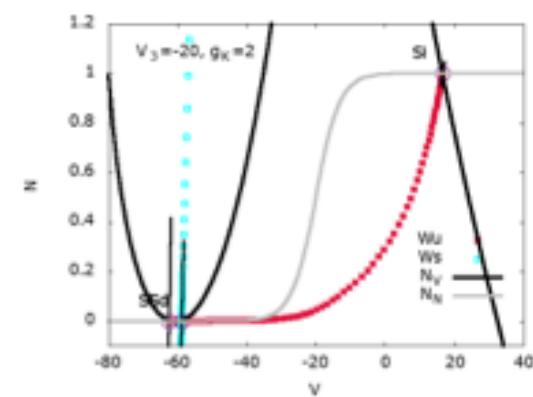
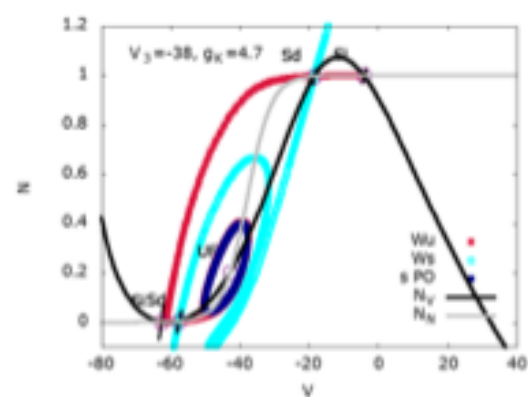
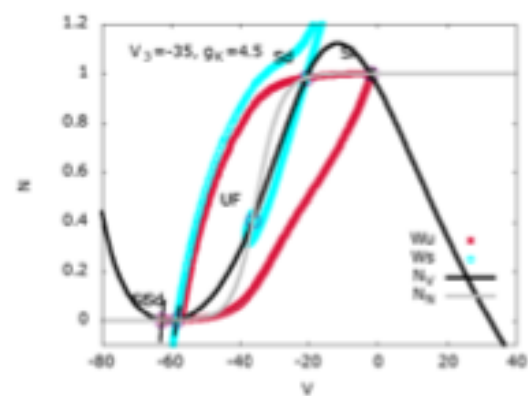
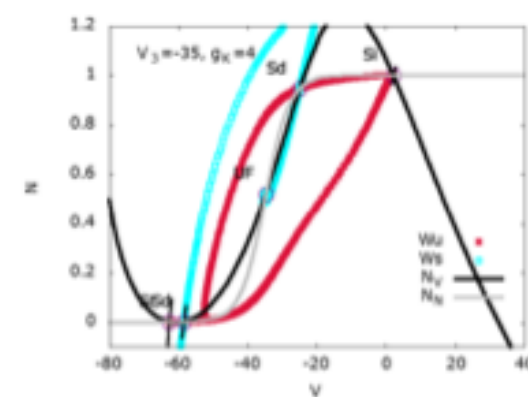
# How do SACs lose their excitability?

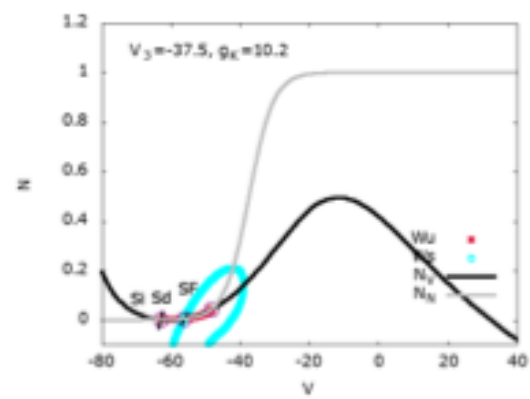
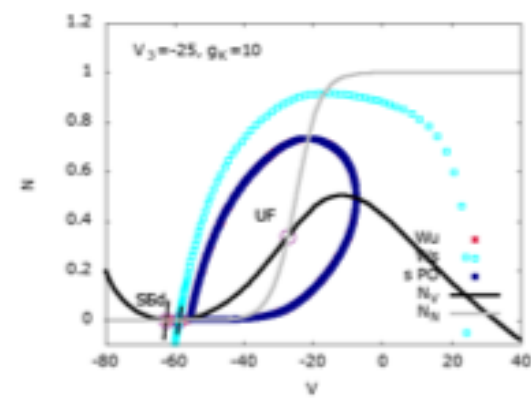
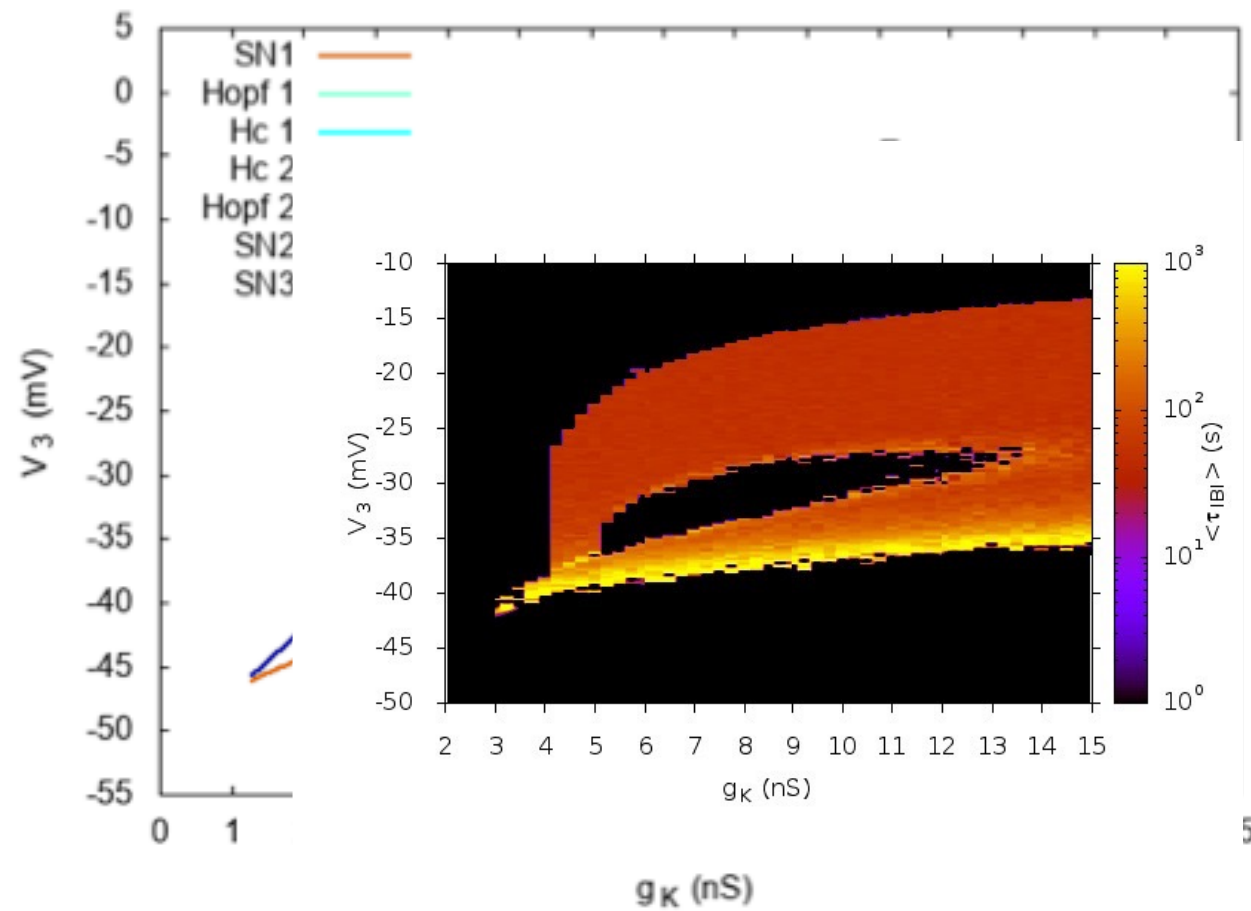
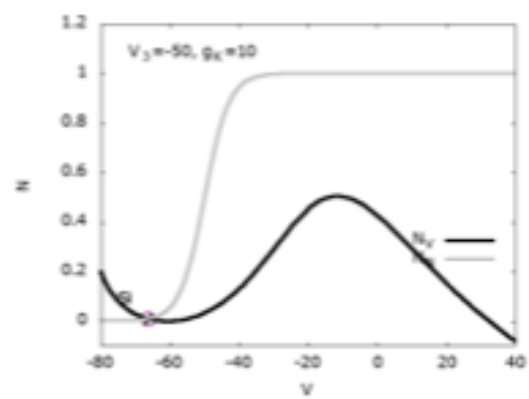
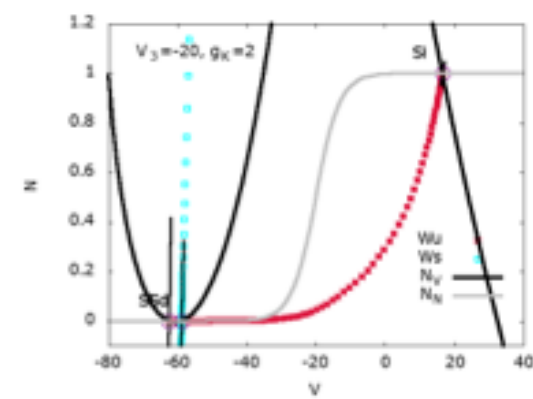
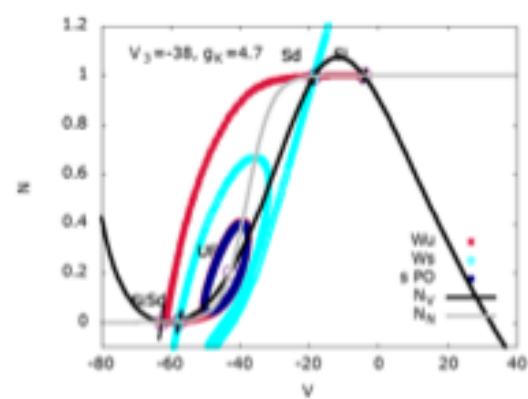
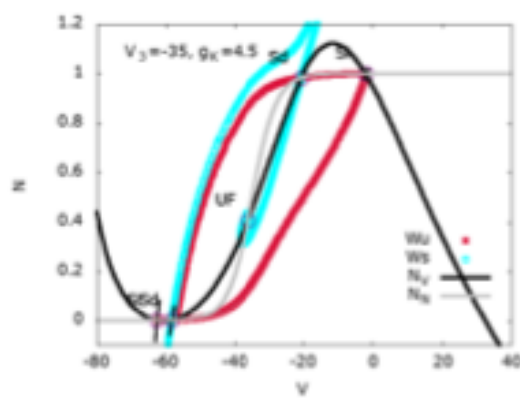
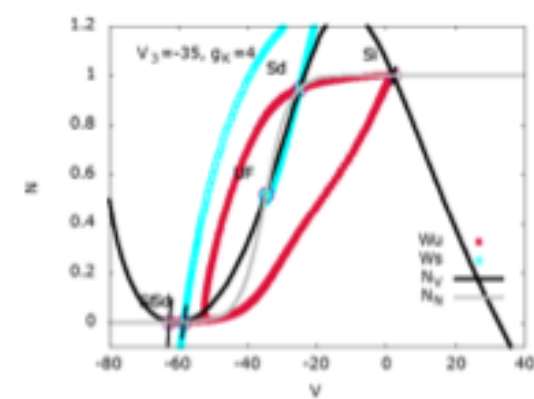
**A**



**Potassium channels  
(potentially Kv3)  
are modelled by 3  
parameters  
gK, V3, V4**

**\*TEA blocks Kv3 channels**

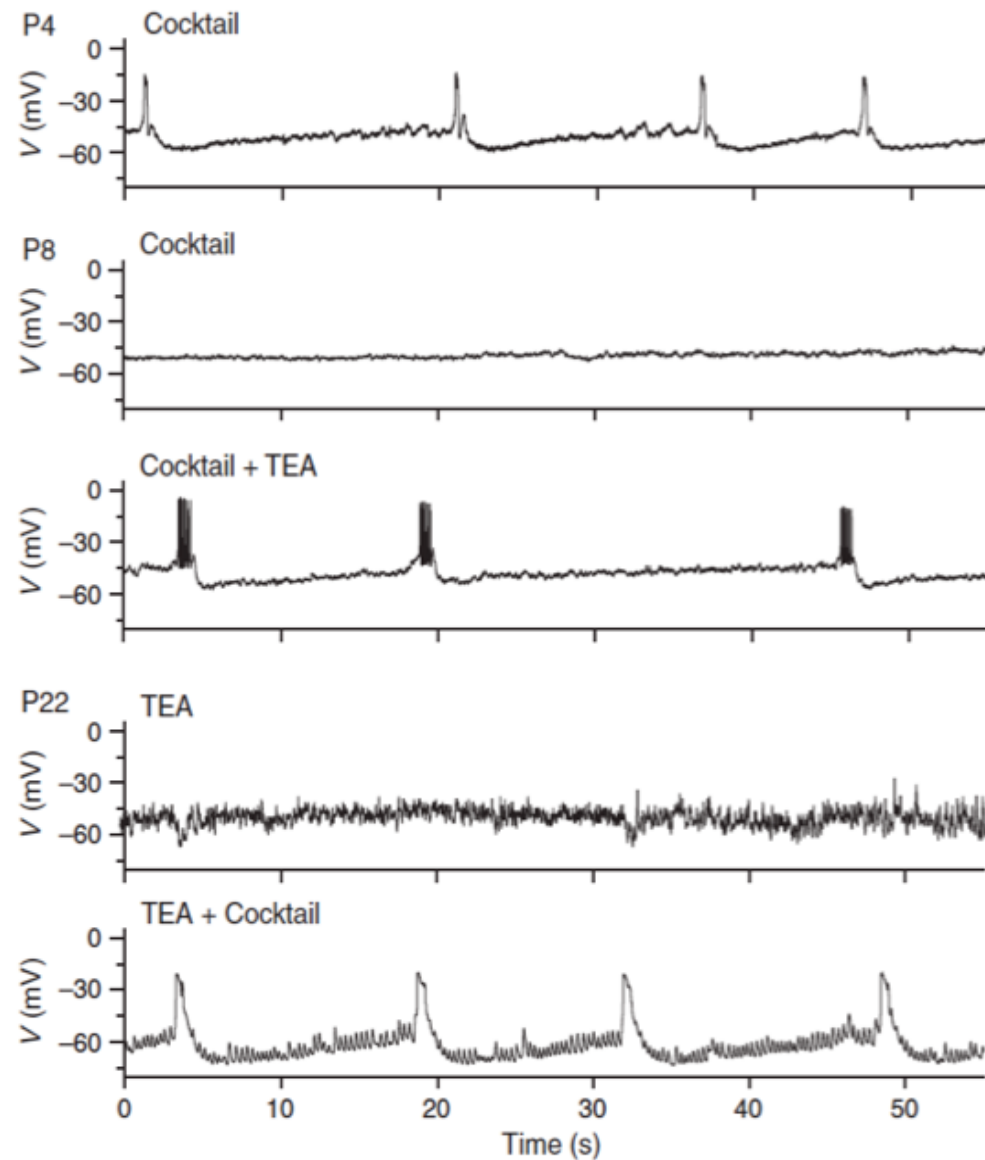
**B****C****A****E****H****G****F**

**B****C****A****E****H****G****F**

# Predict the role of Kv3 channels in the loss of SACs excitability

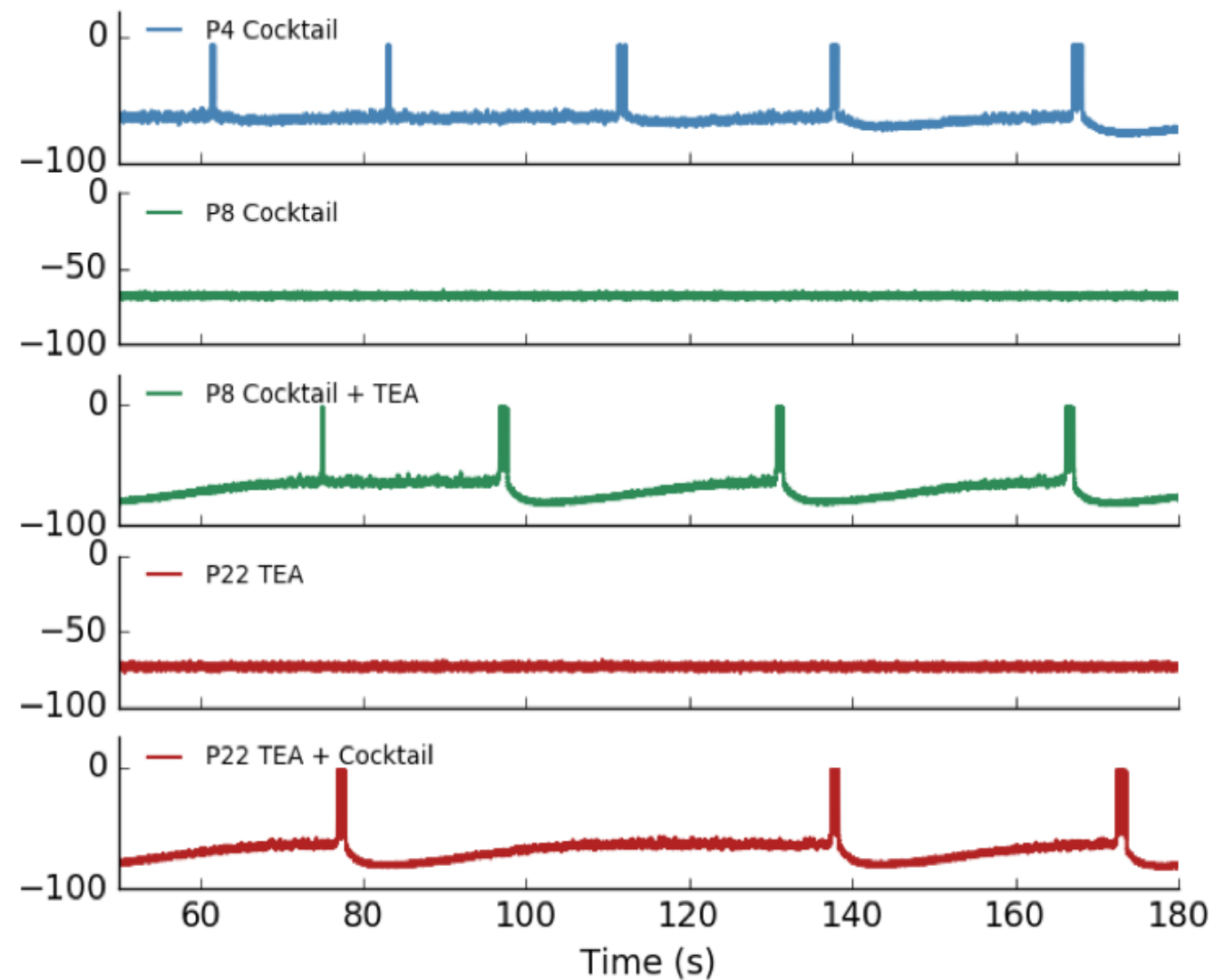
**A**

**Experiment (Zheng et al. 2006)**



**B**

**Model**

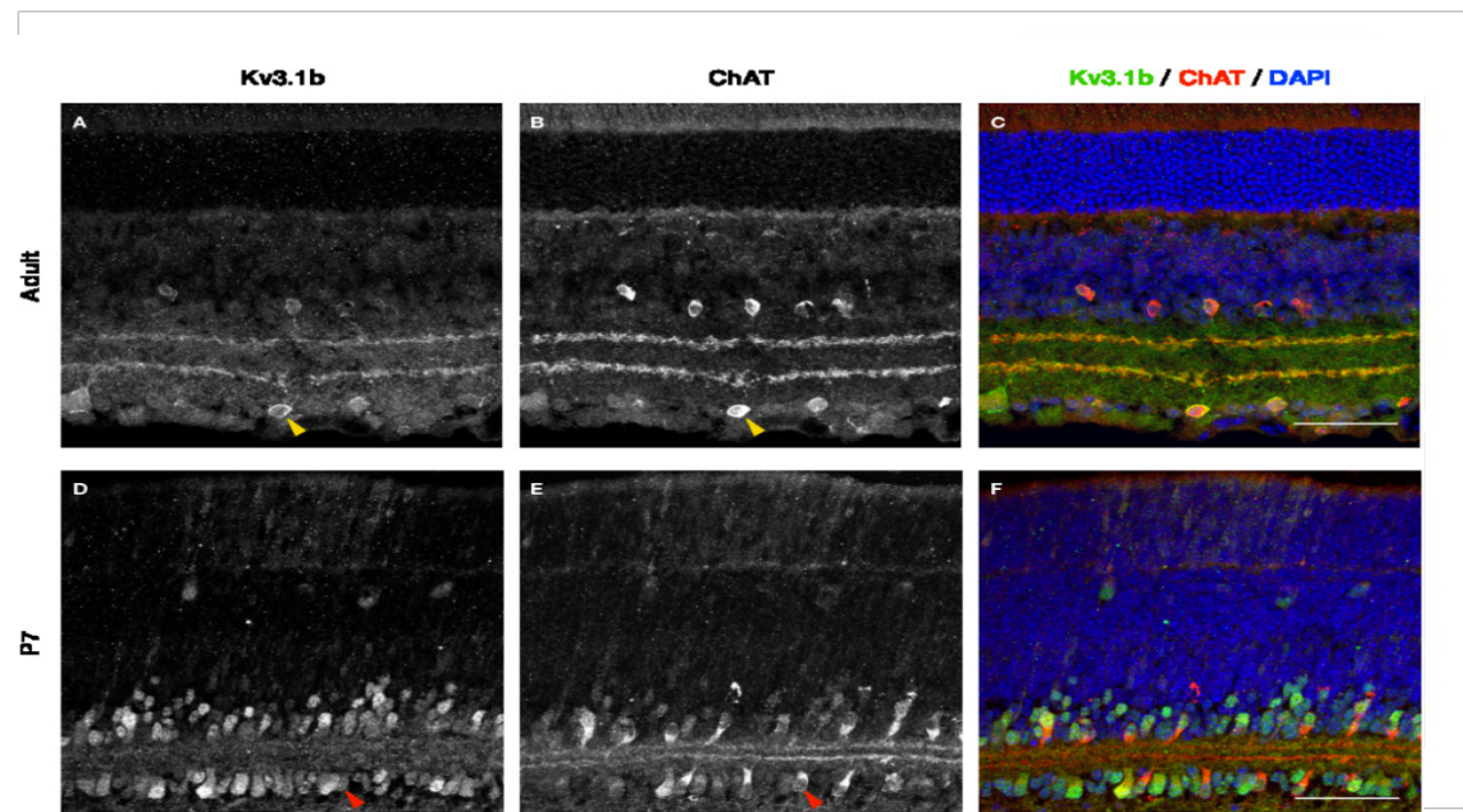




# How do SACs lose their excitability?

**Hypothesis: The expression of the potassium Kv3 channels increases upon maturation possibly leading to the loss of SACs excitability**

## Preliminary experimental exploration



(O.Marre-E. Orendorff)

### Localization of Kv3.1b in adult and P7 retinas.

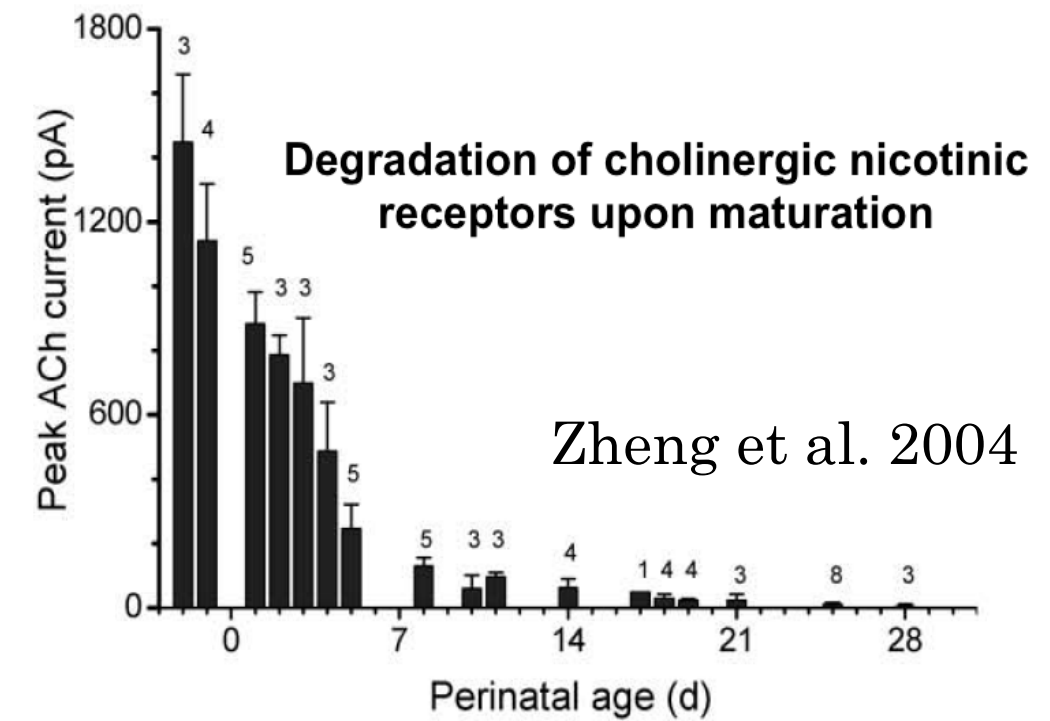
(A-C) Adult retina section showing Kv3.1b (green) and choline acetyltransferase (ChAT, red) reactivity in starburst amacrine cells. Cell nuclei stain (DAPI, blue).

(D-F) P7 retina section showing little colocalization of Kv3.1b with ChAT in starburst amacrine cells.

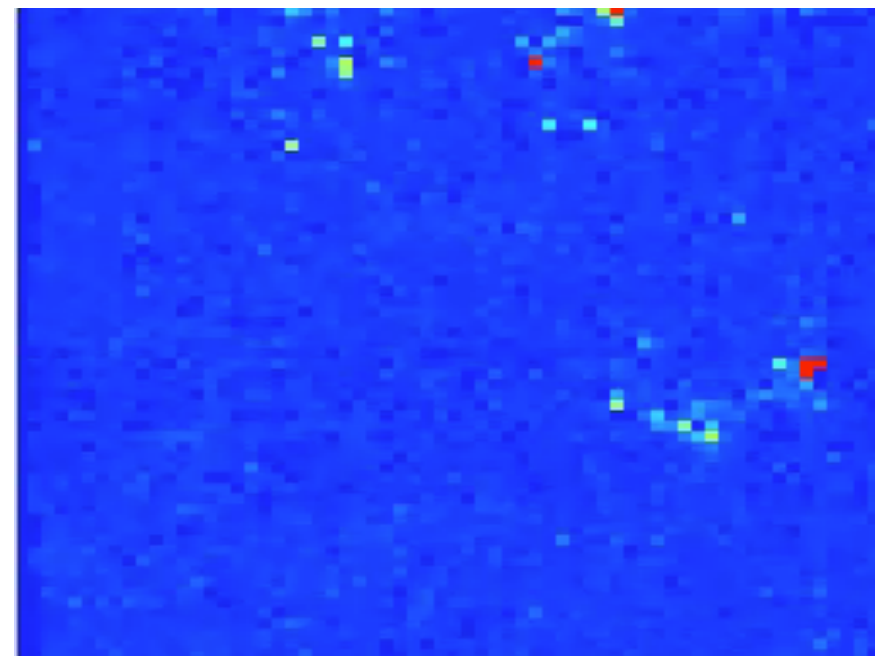
**However, results are preliminary as experiment is not yet conclusive**

# Variability within retinal waves

## ii) Development

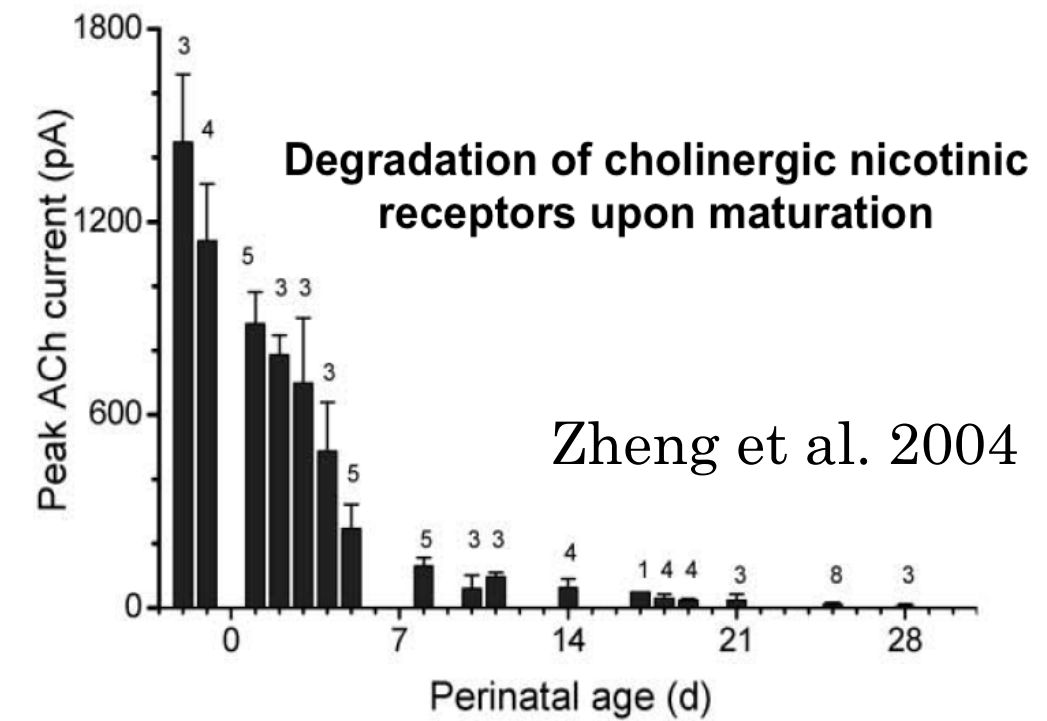


## iv) Spatial Variability

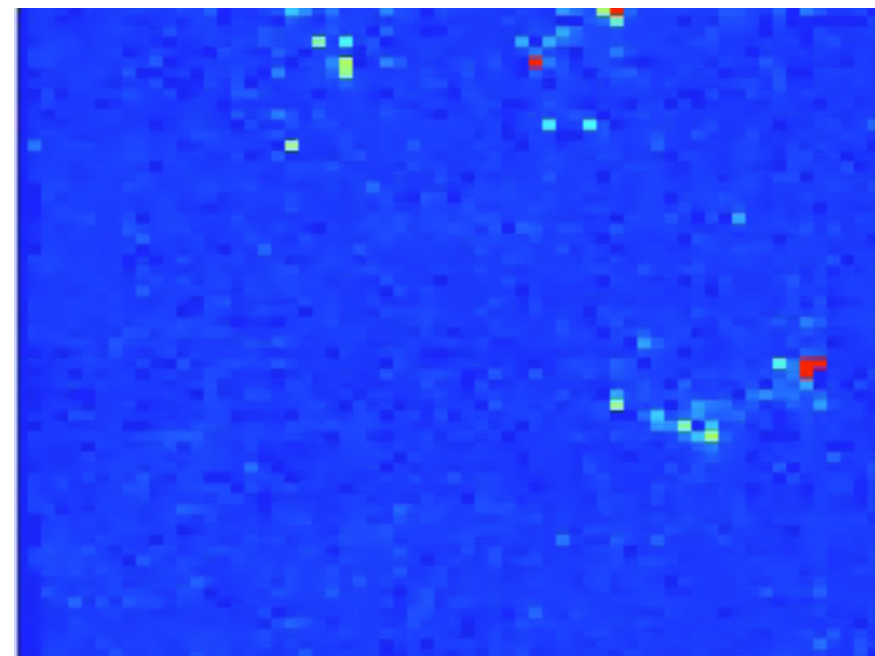


# Variability within retinal waves

## ii) Development



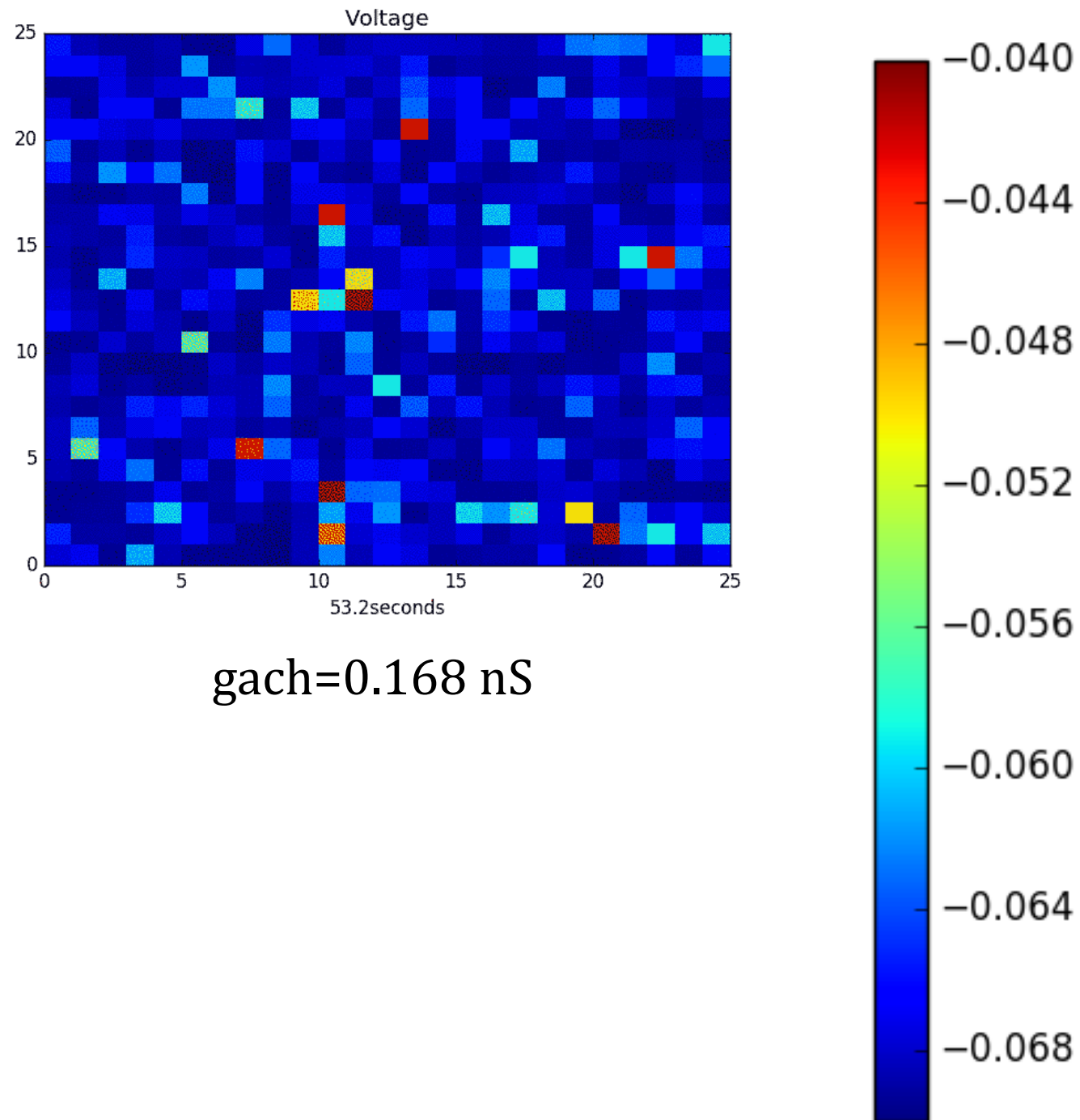
## iv) Spatial Variability



# Network of SACs : Simulated Voltage

Isolated Neurons

$g_{ach}=0.126 \text{ nS}$



$g_{ach}=0.168 \text{ nS}$

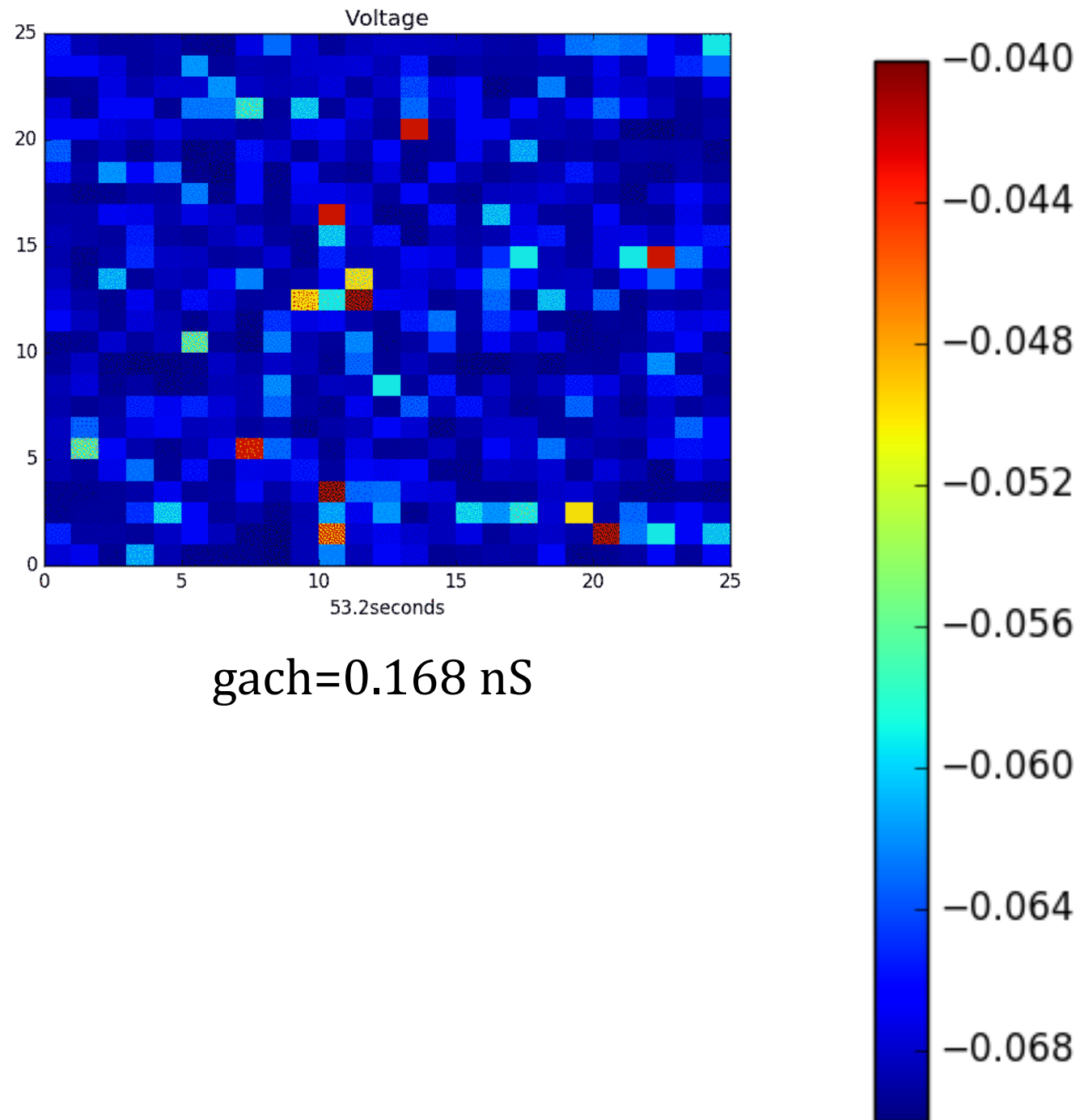
$g_{ach}=0.21 \text{ nS}$



# Network of SACs : Simulated Voltage

Isolated Neurons

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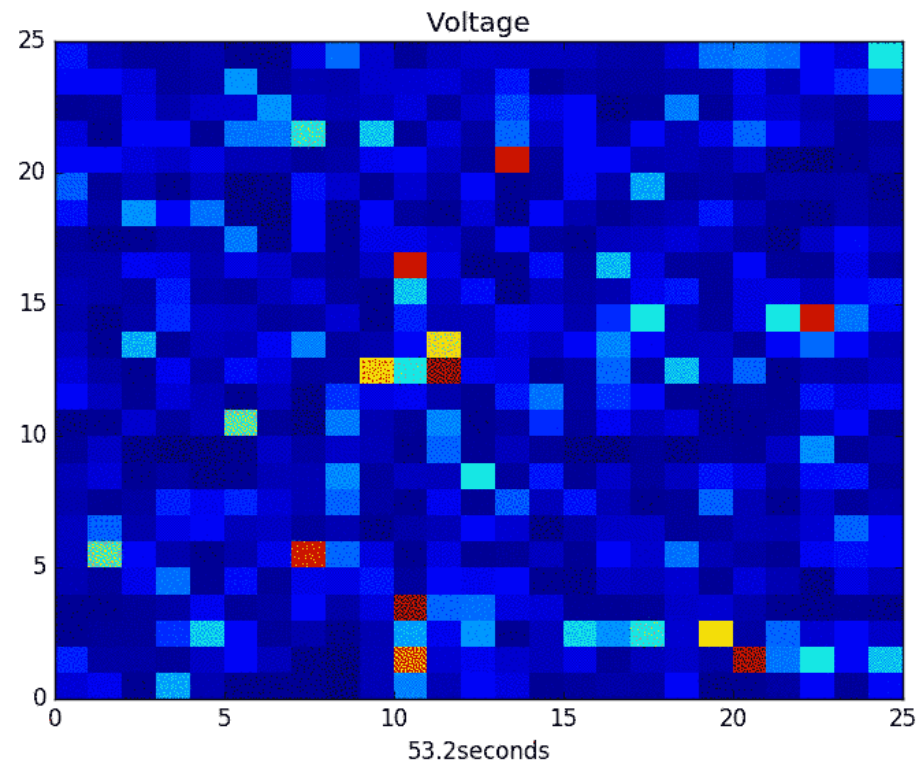
$g_{ach}=0.168$  nS

$g_{ach}=0.21$  nS

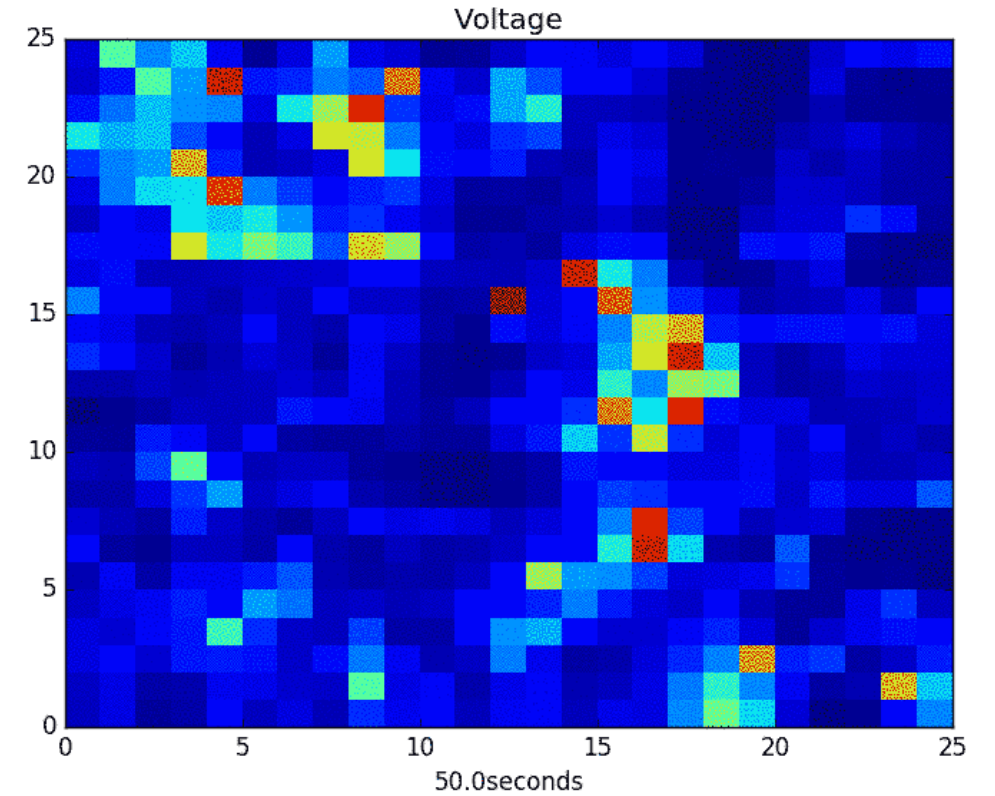
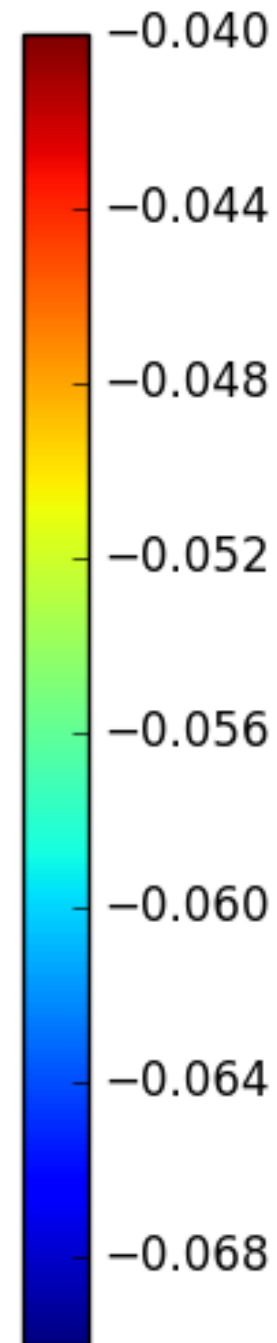
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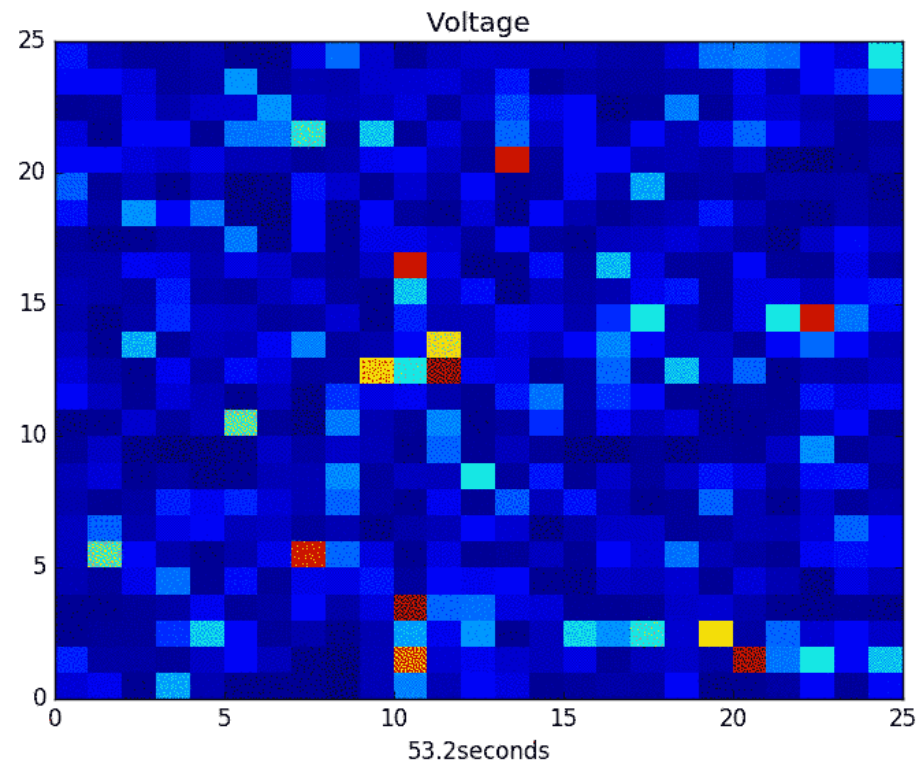


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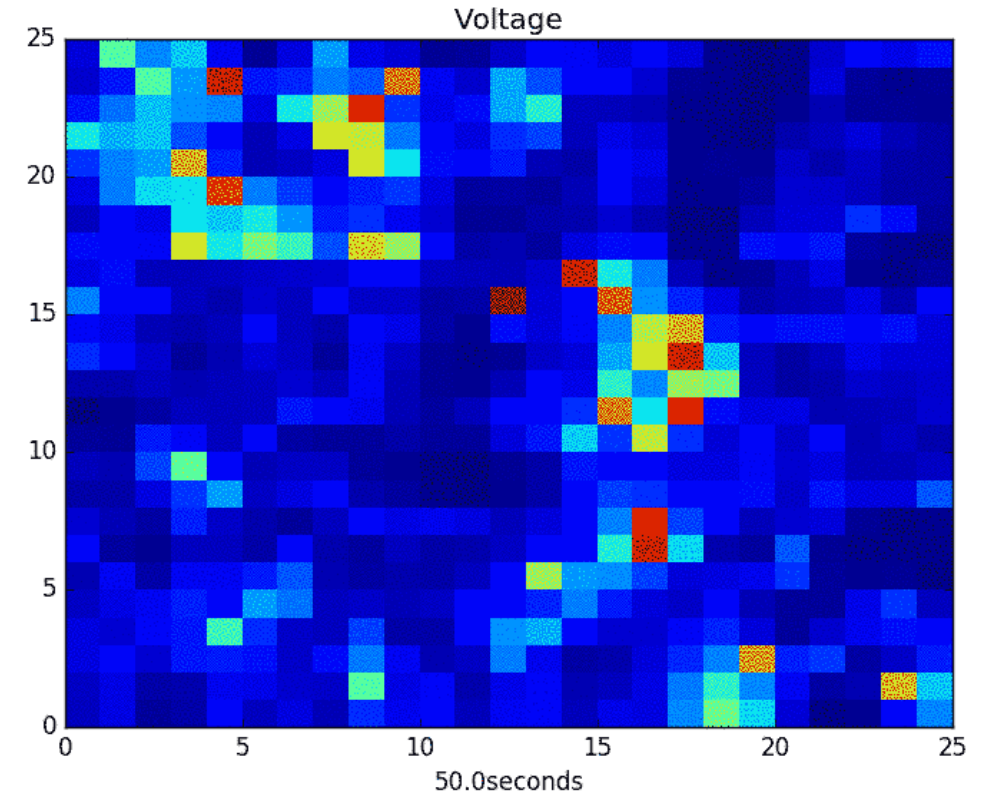
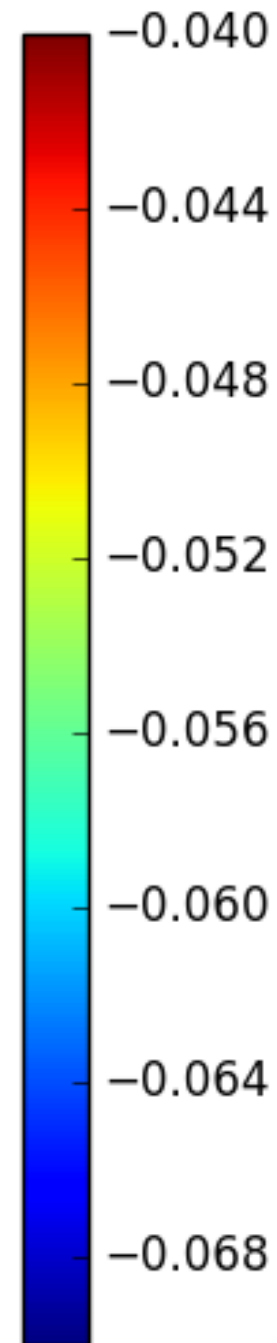
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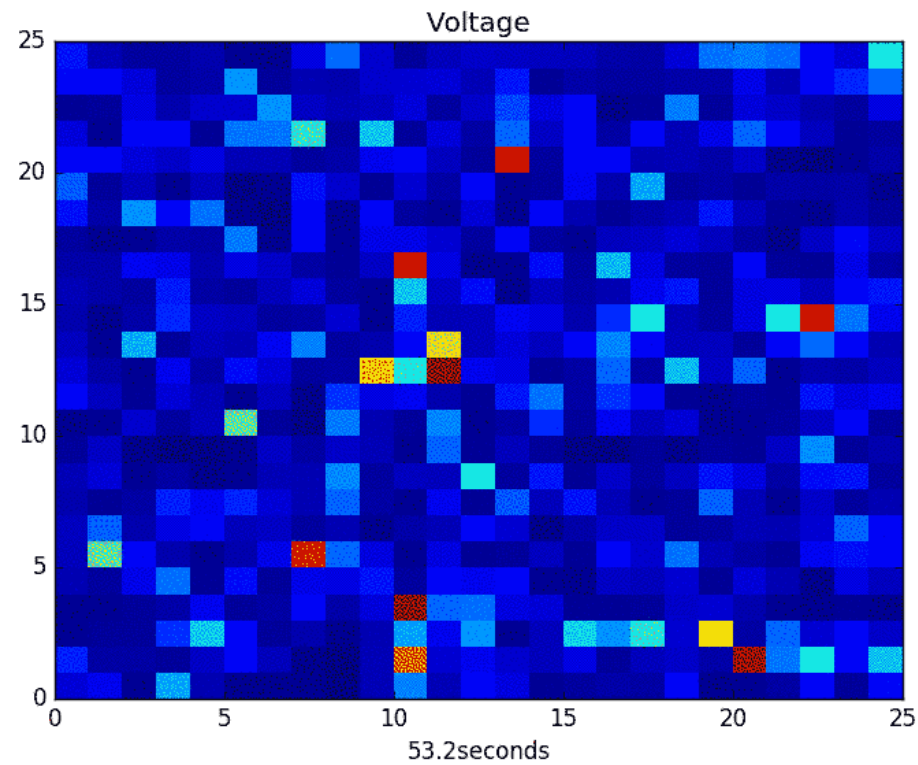
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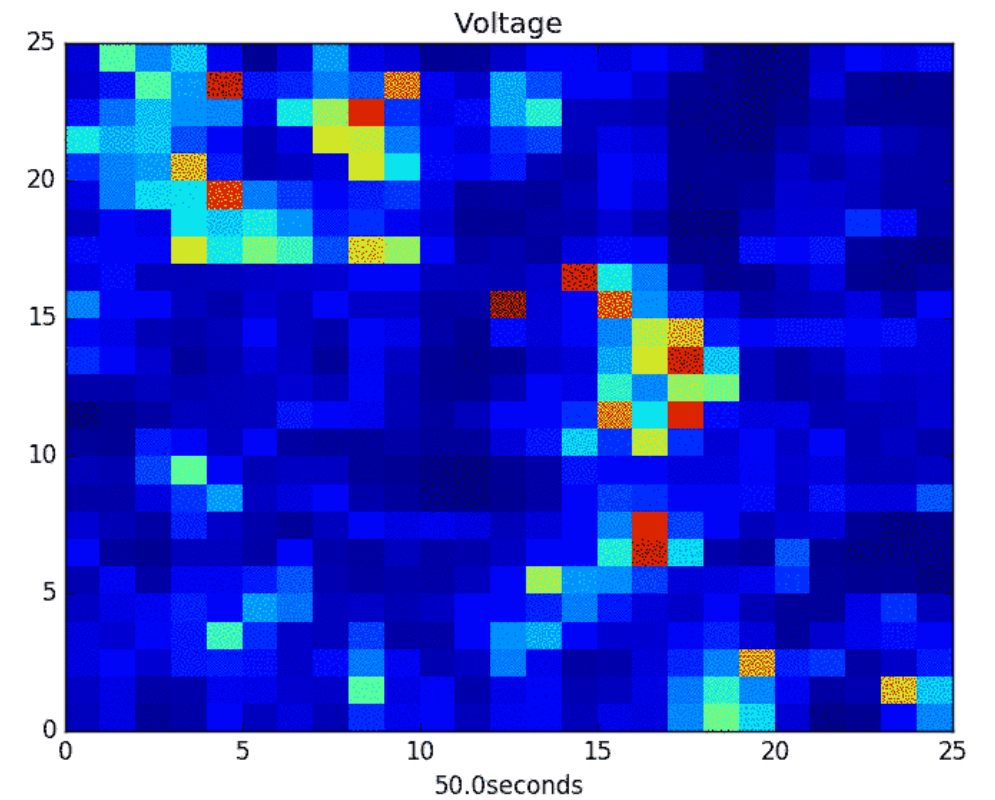
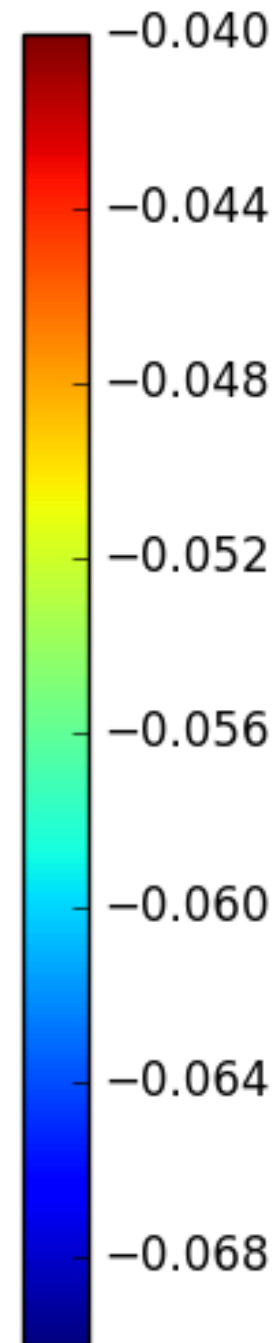
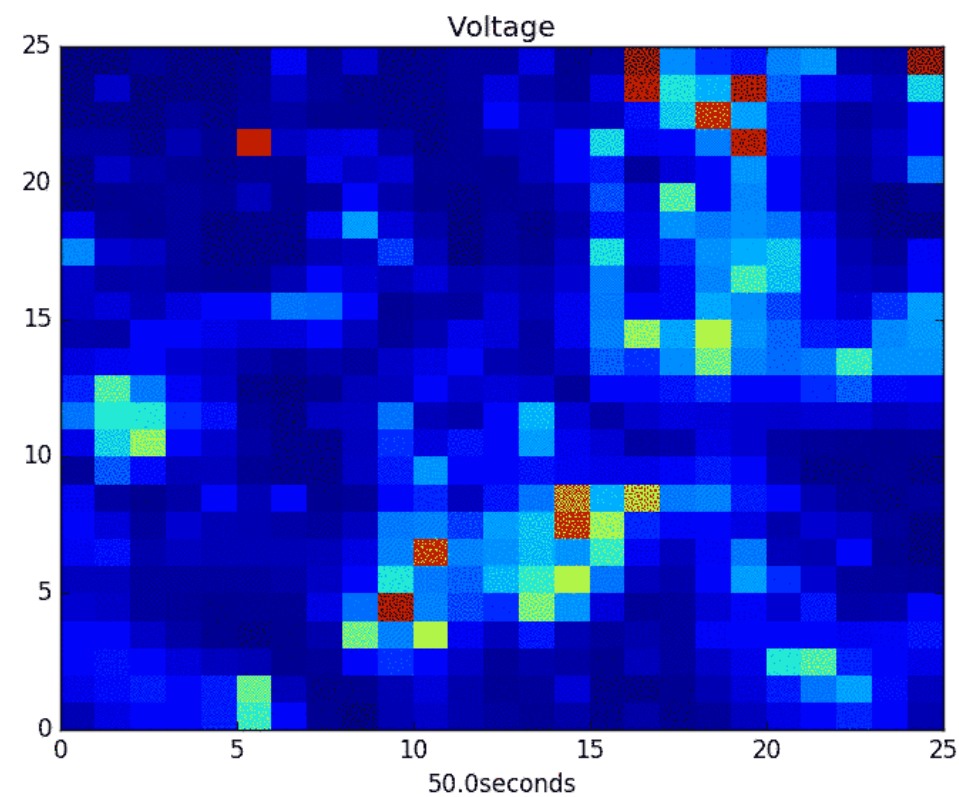
# Network of SACs : Simulated Voltage

Isolated Neurons

$g_{ach}=0.126$  nS



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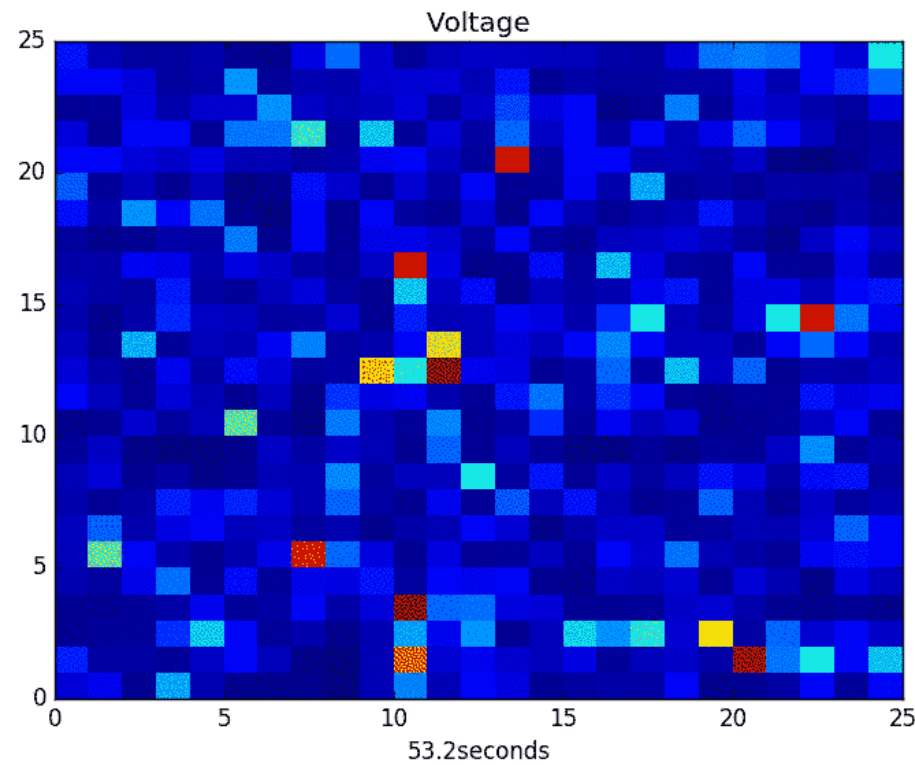


$g_{ach}=0.21$  nS

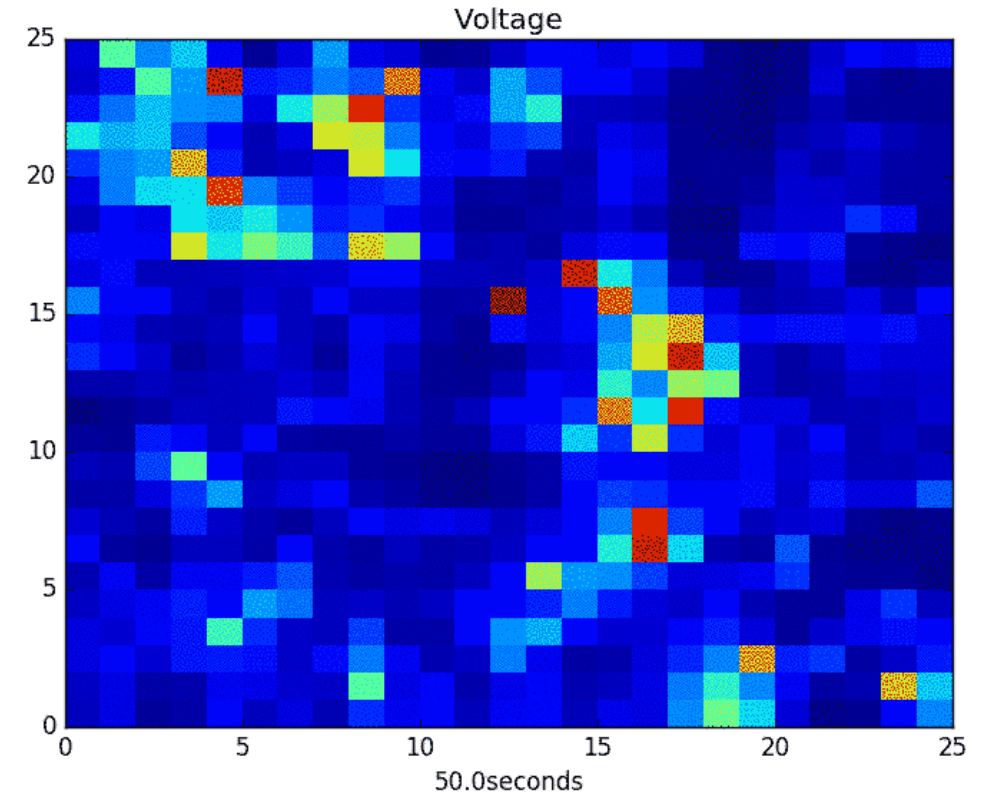
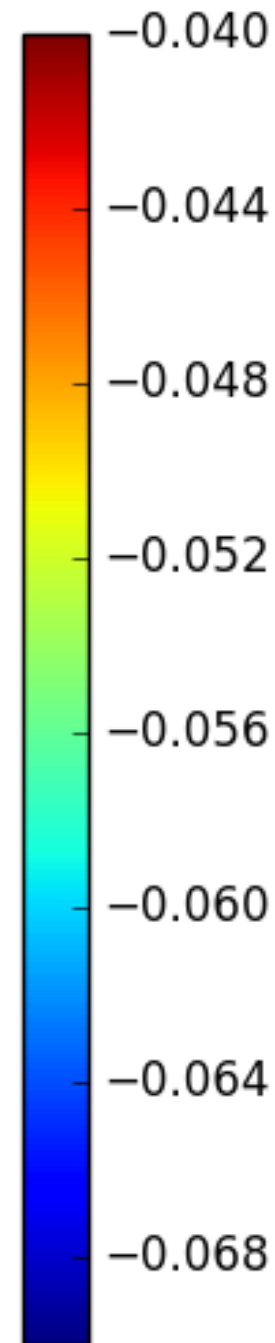
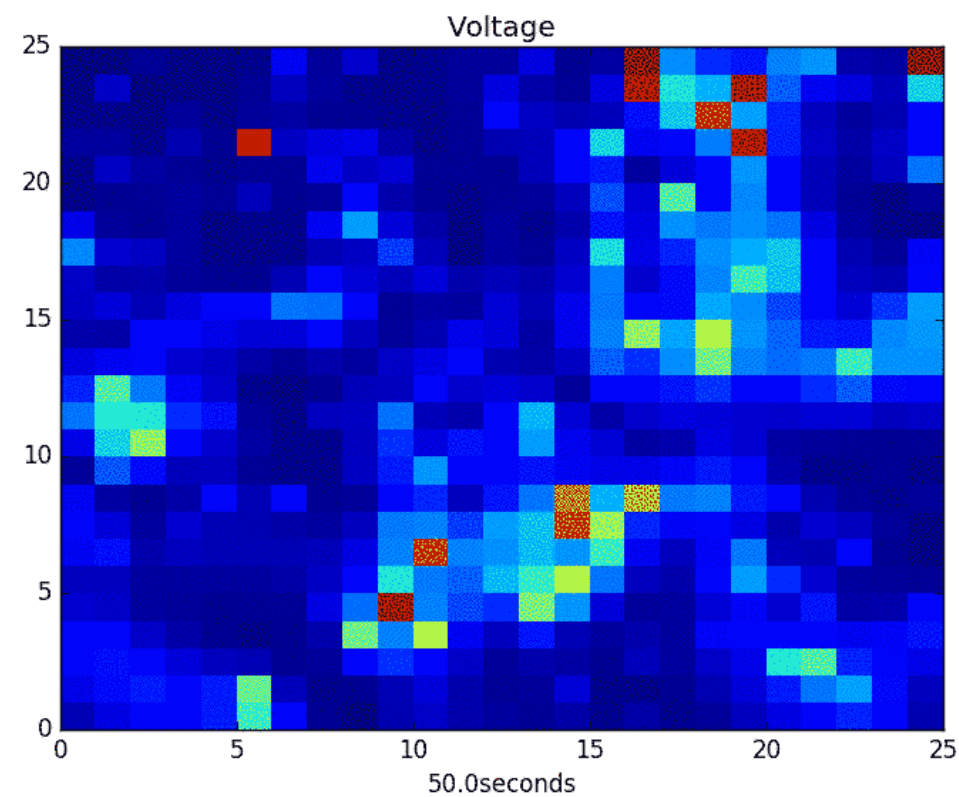
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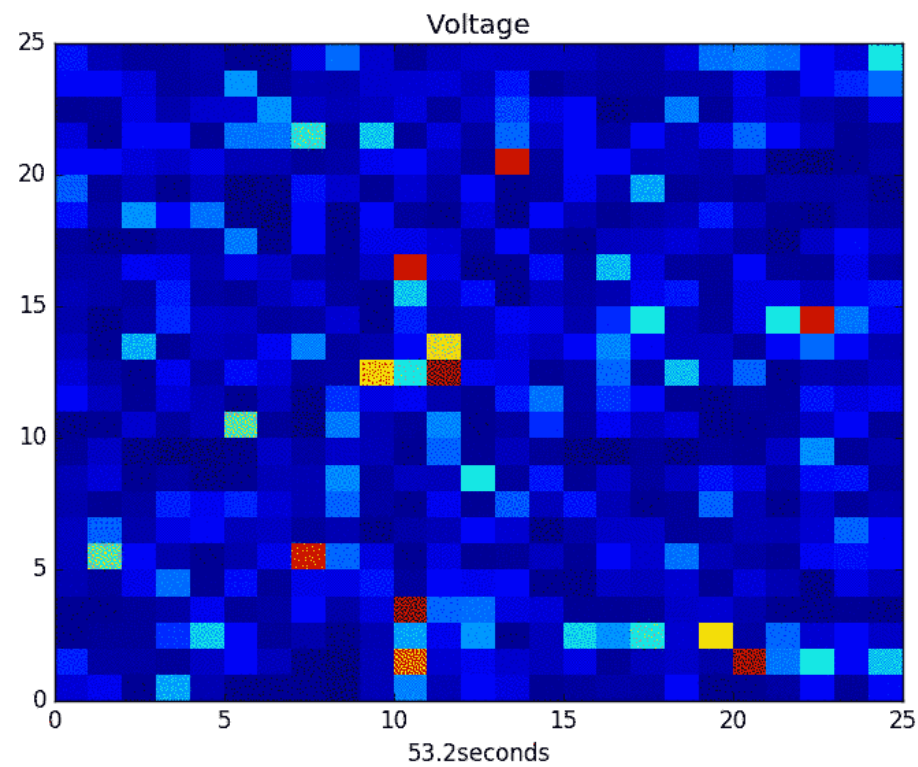


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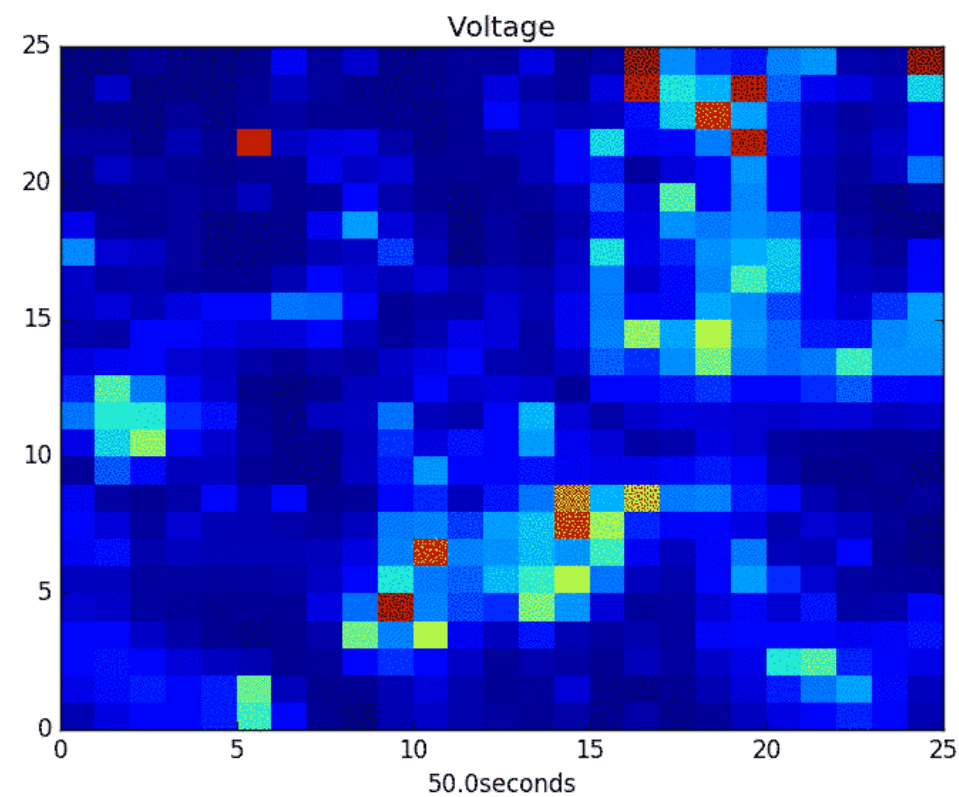


# Network of SACs : Simulated Voltage

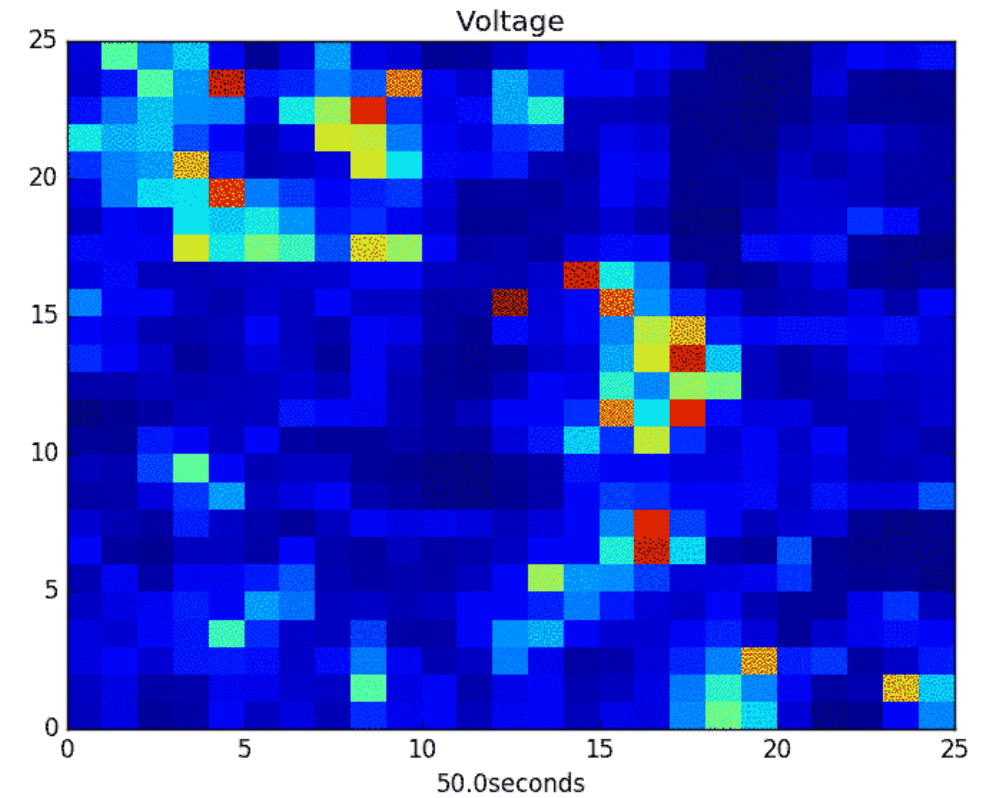
Isolated Neurons



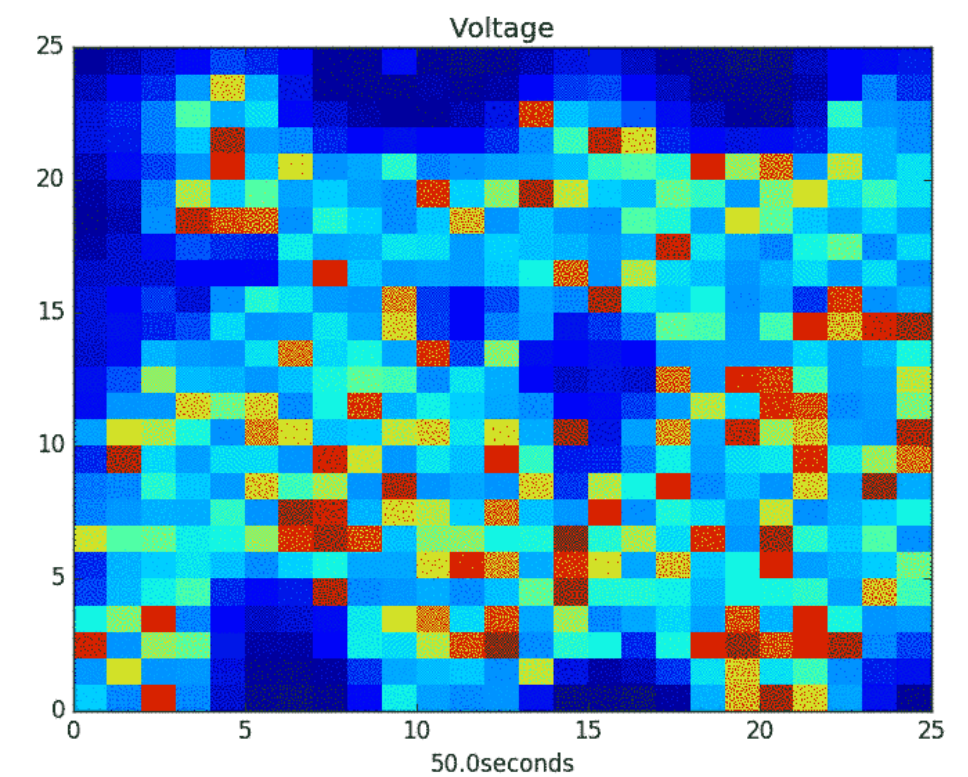
$g_{ach}=0.168$  nS



$g_{ach}=0.126$  nS



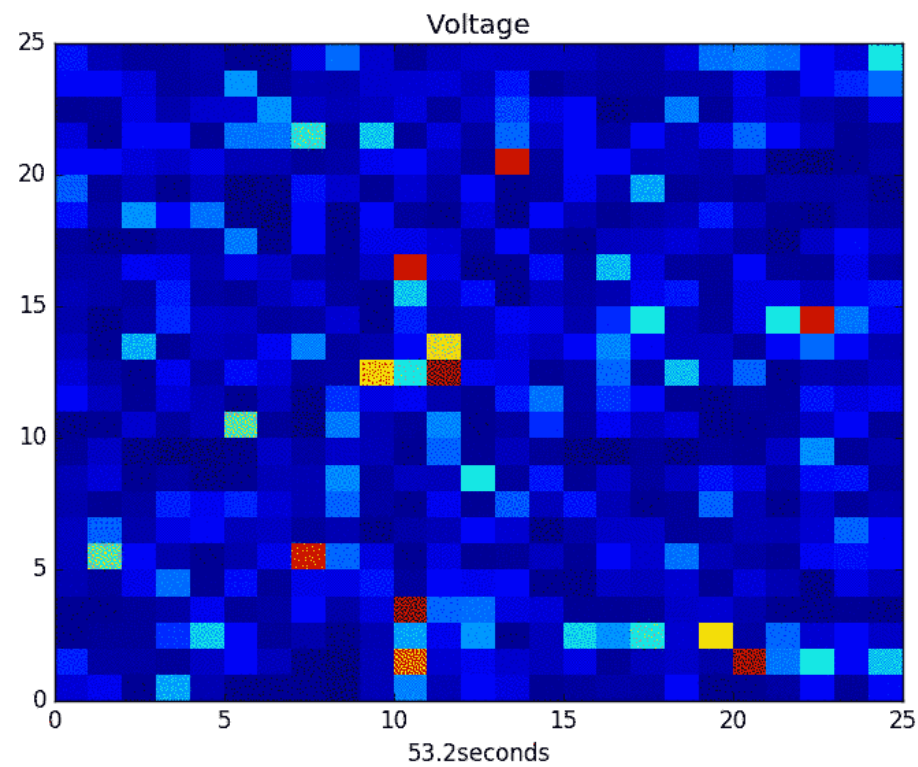
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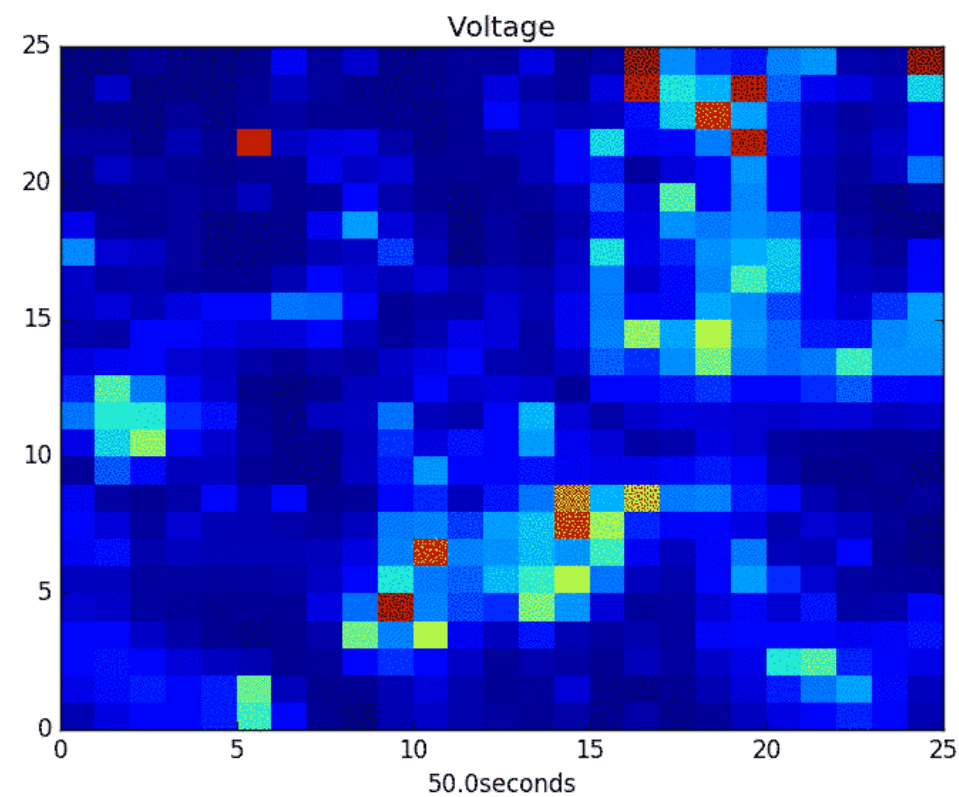


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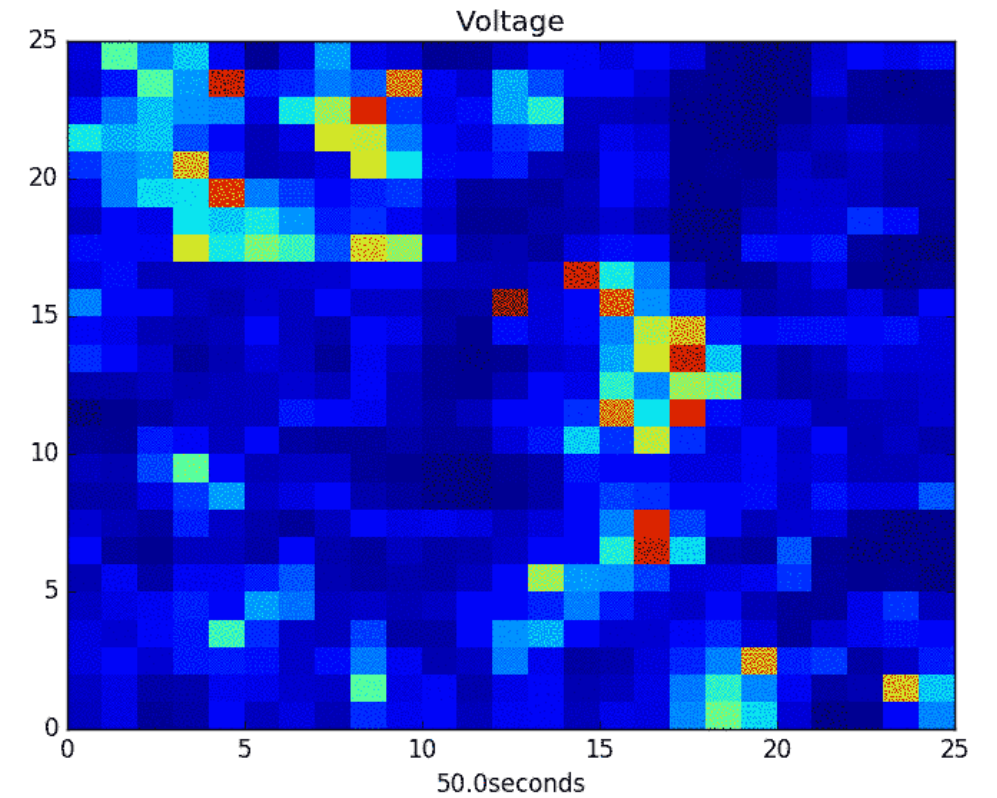
Isolated Neurons



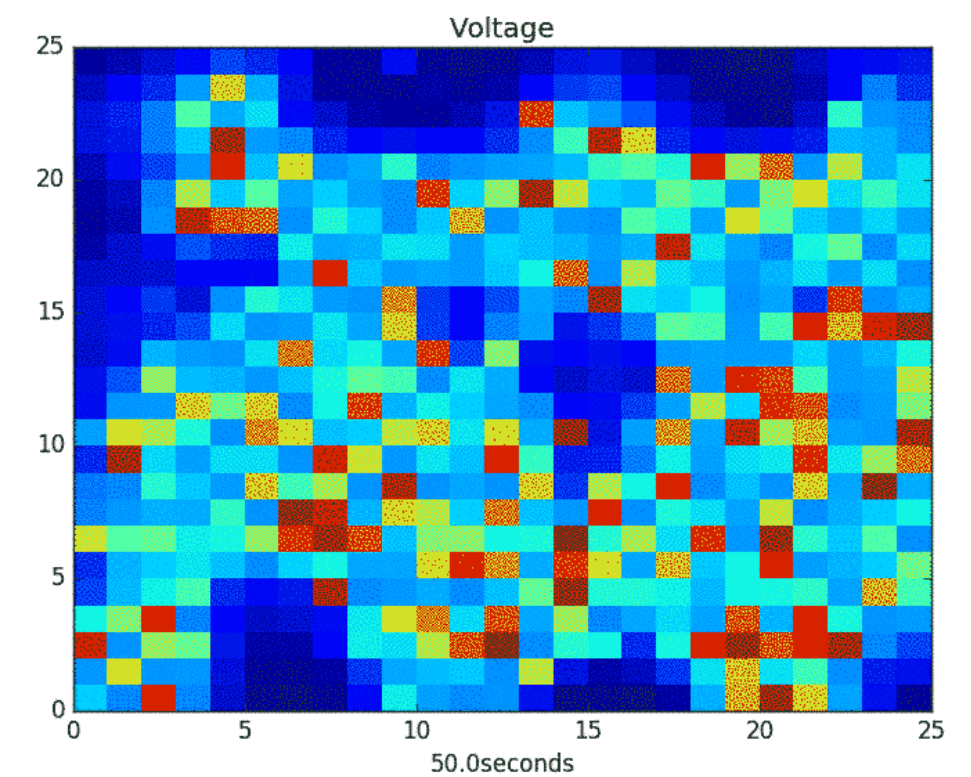
$g_{ach}=0.168$  nS



$g_{ach}=0.126$  nS

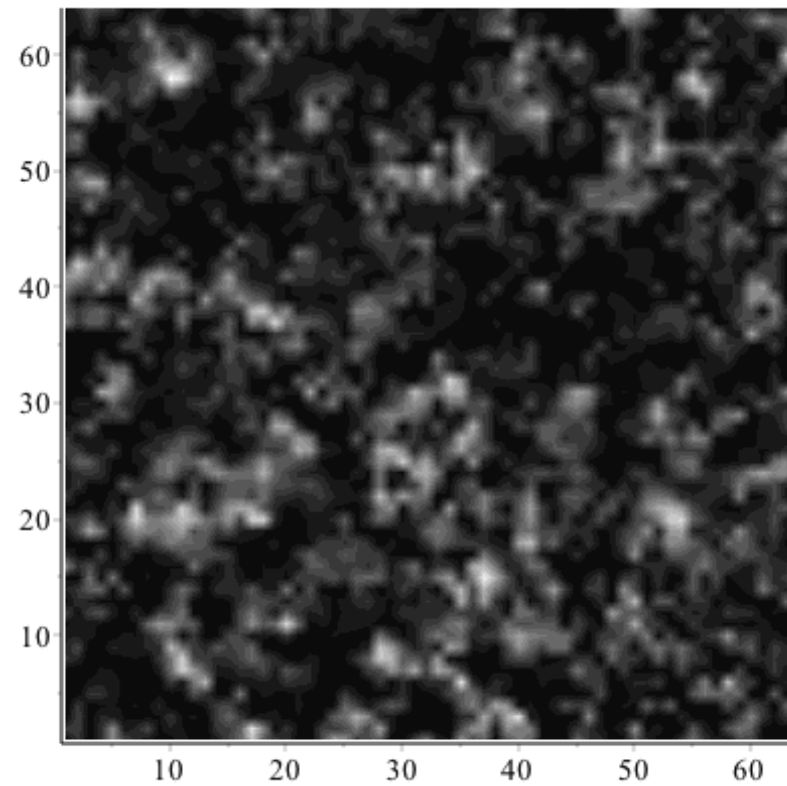


$g_{ach}=0.21$  nS

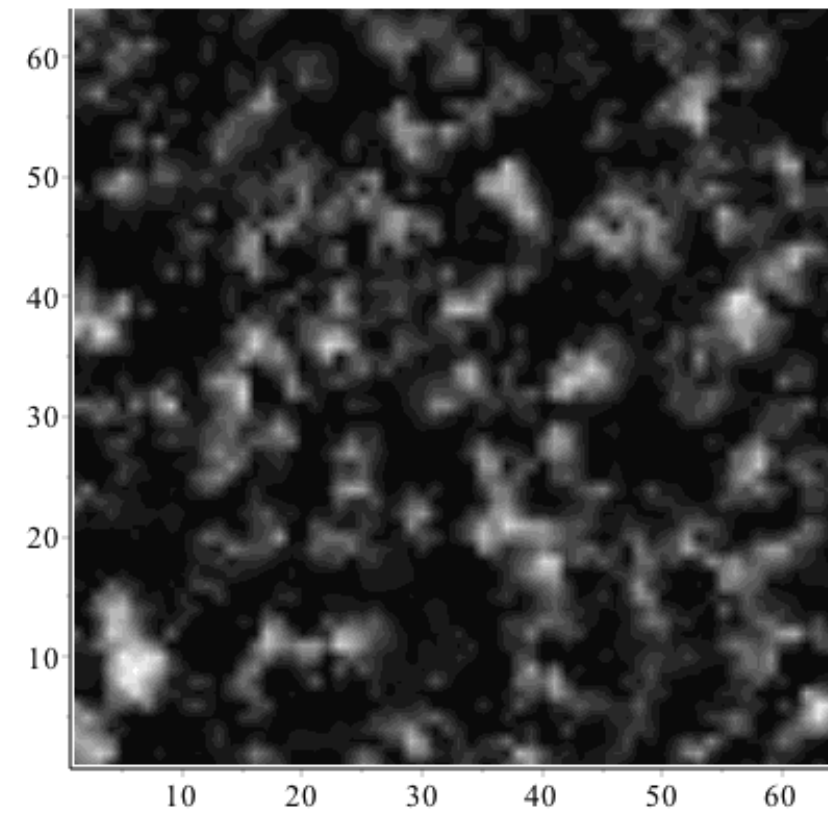


# Network of SACs : Simulated Calcium Concentration

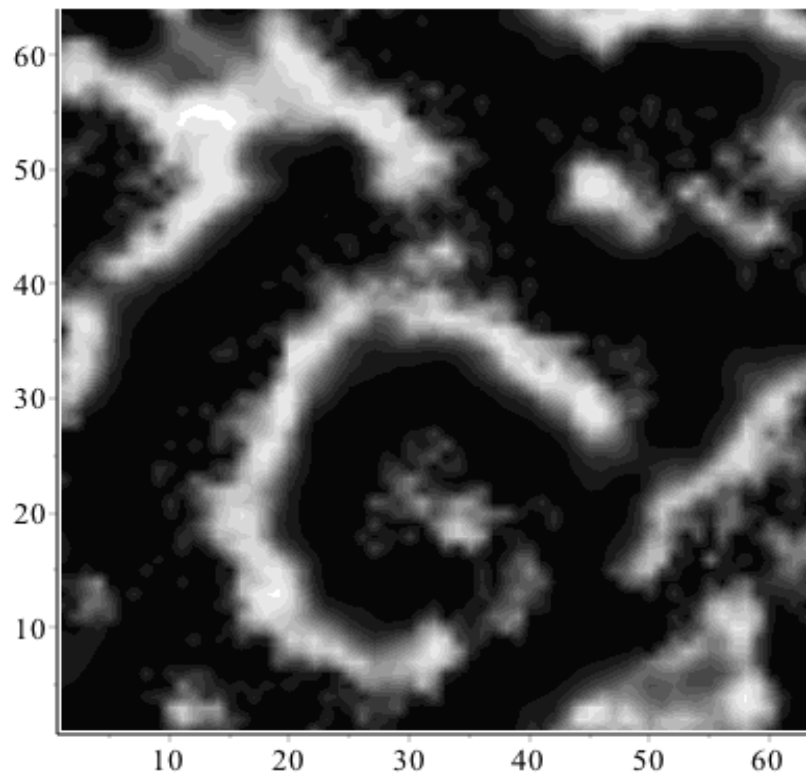
$g_{ach}=0.102$  nS



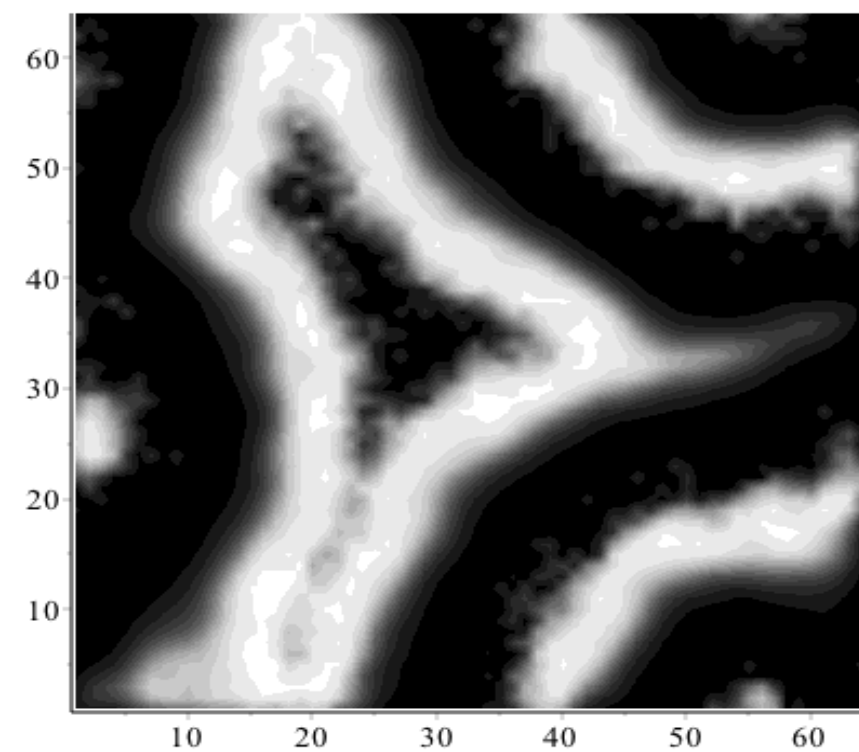
$g_{ach}=0.126$  nS



$g_{ach}=0.168$  nS



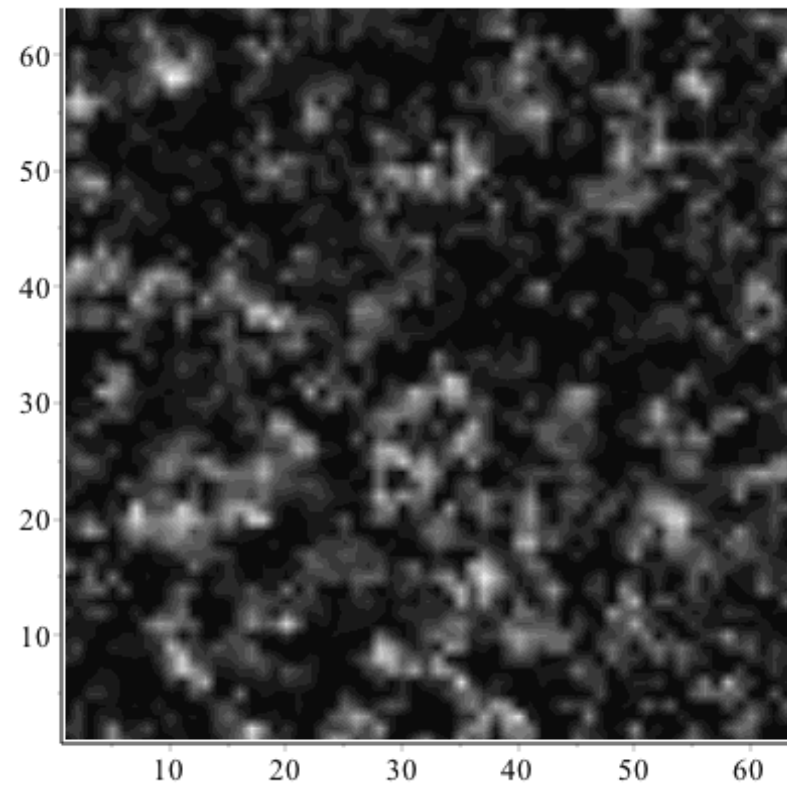
$g_{ach}=0.21$  nS



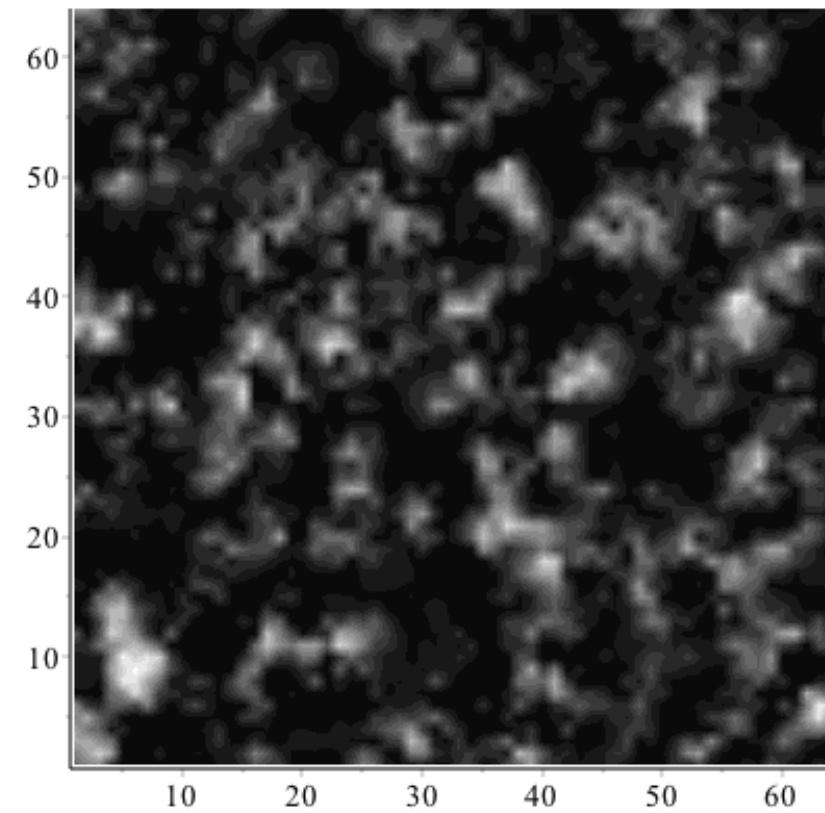


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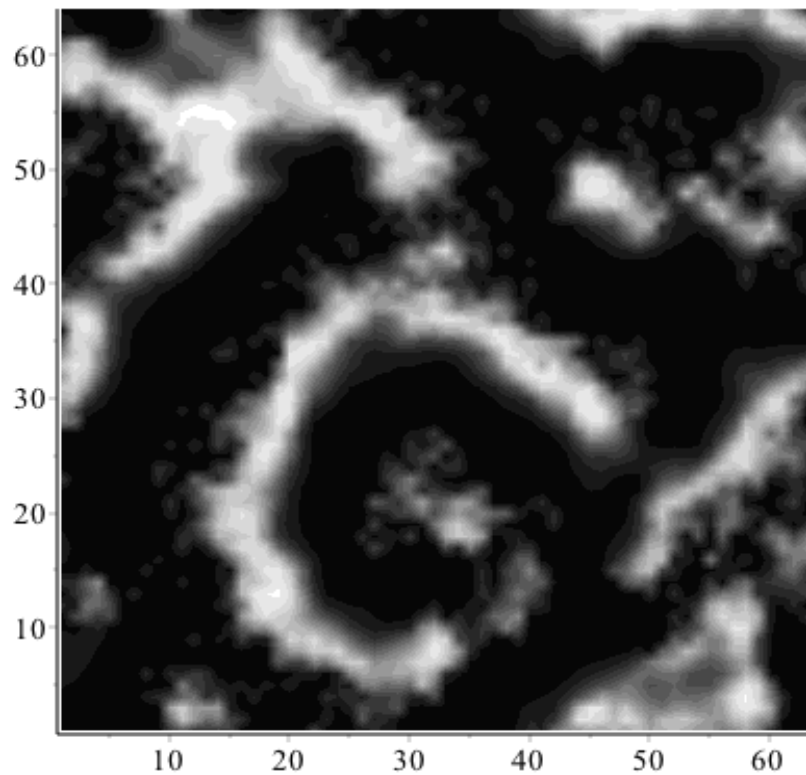
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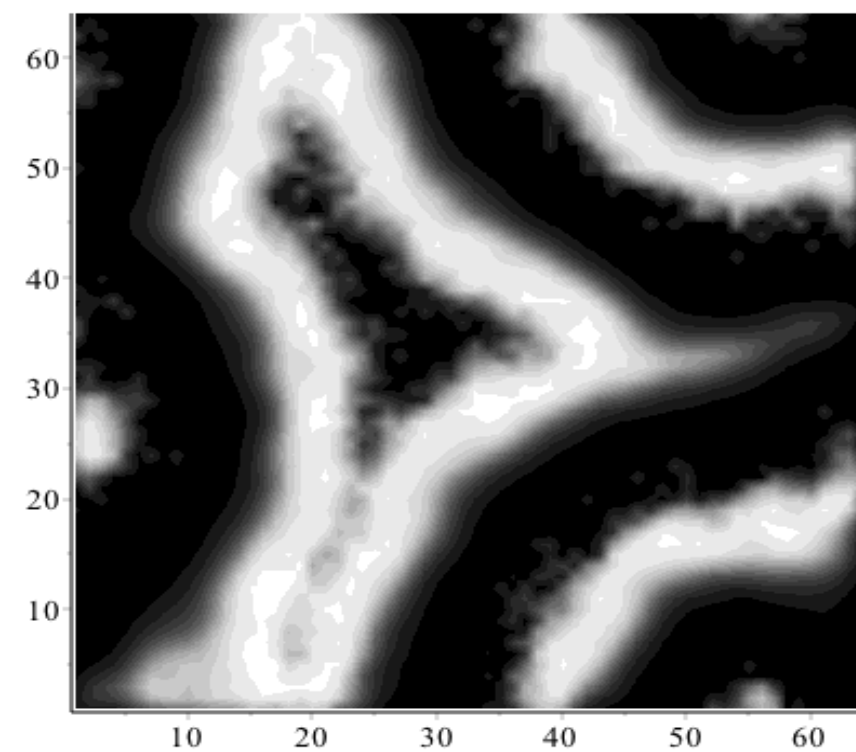
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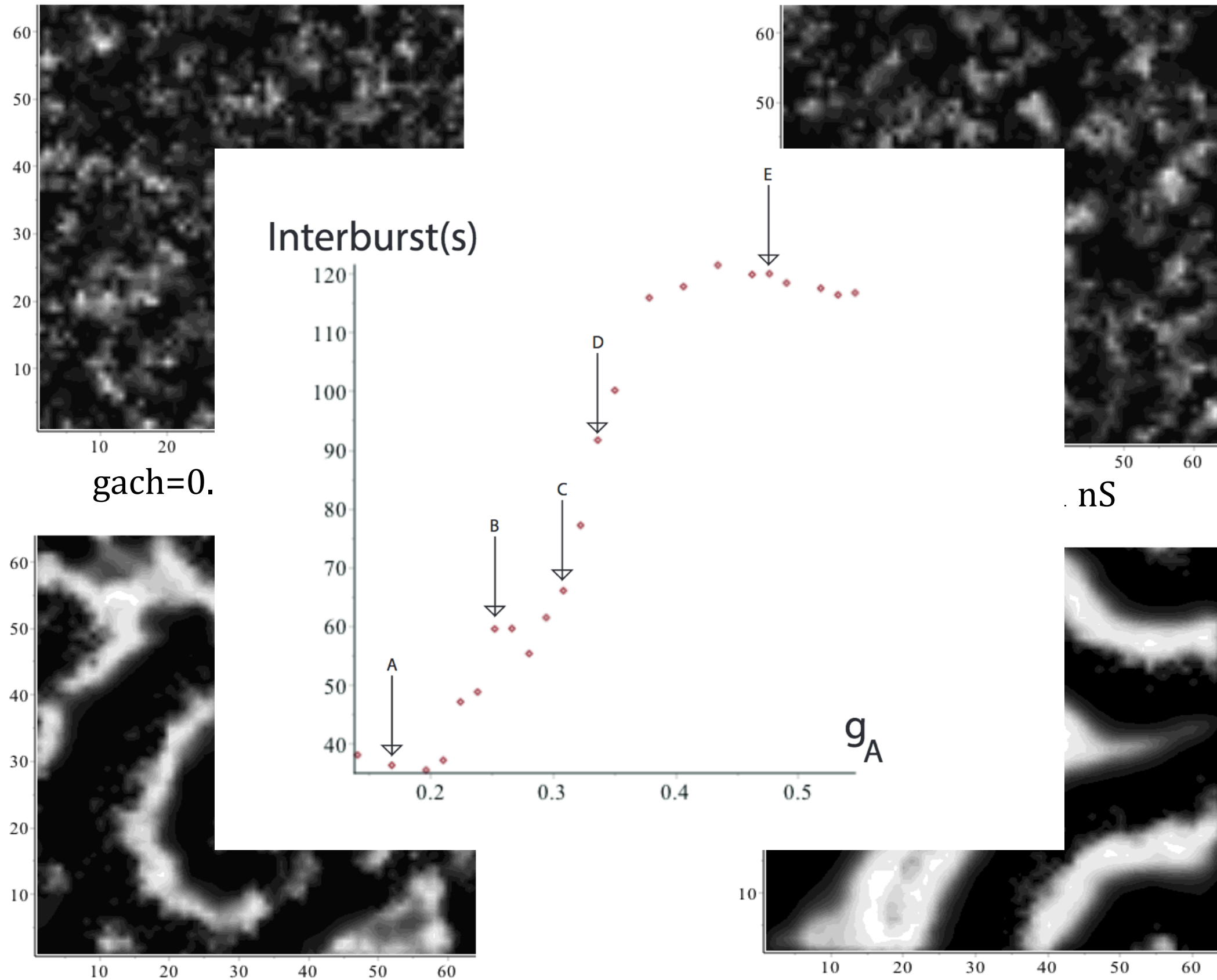
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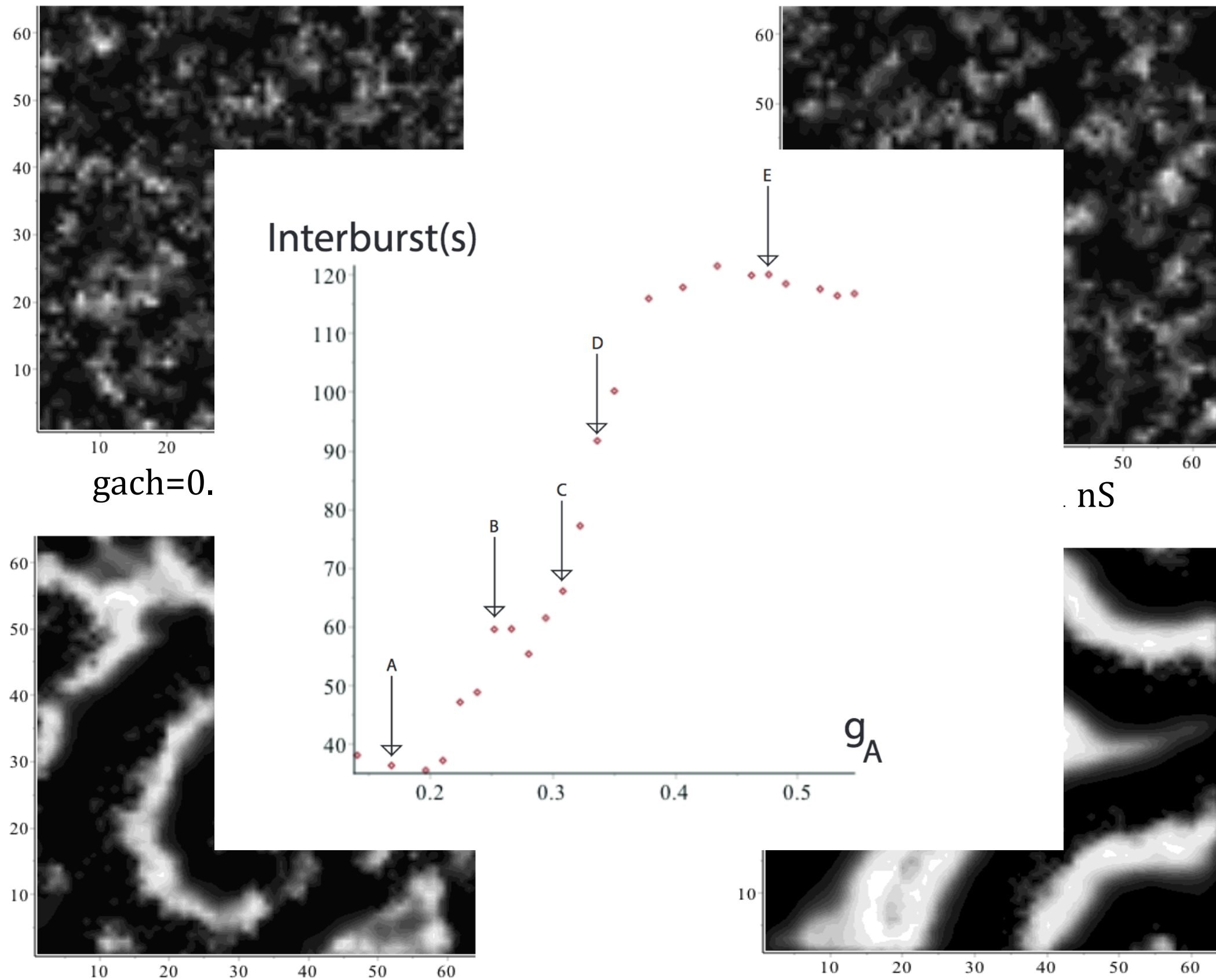
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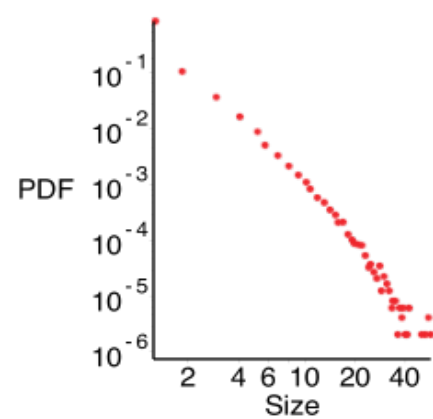
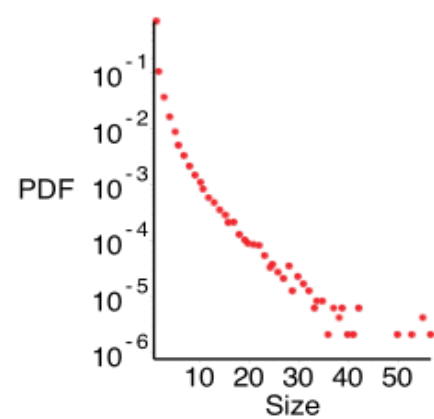


# Waves size distribution

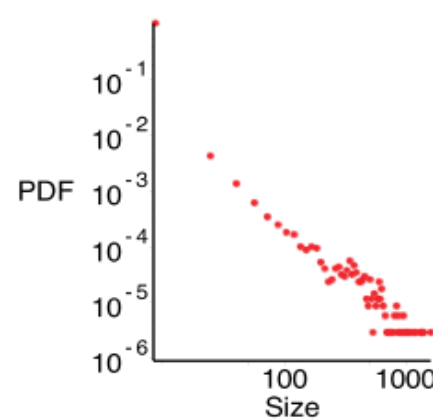
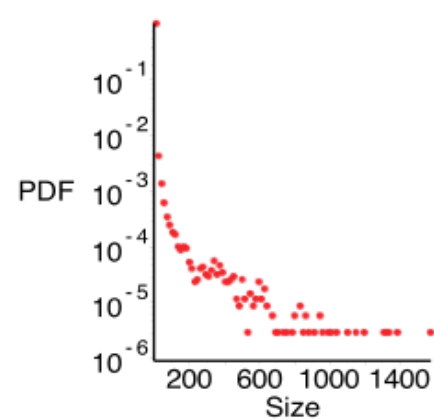
lin-log

log-log

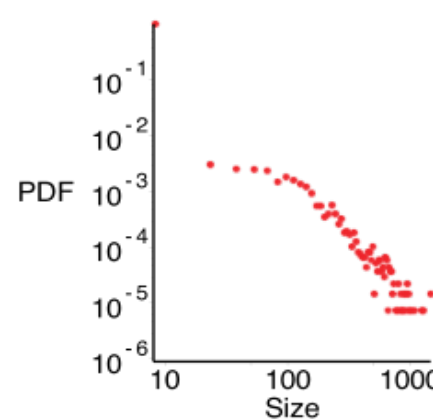
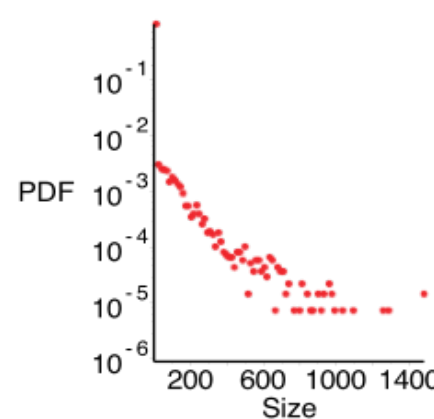
A



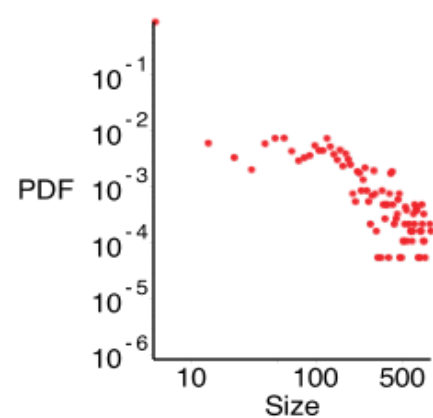
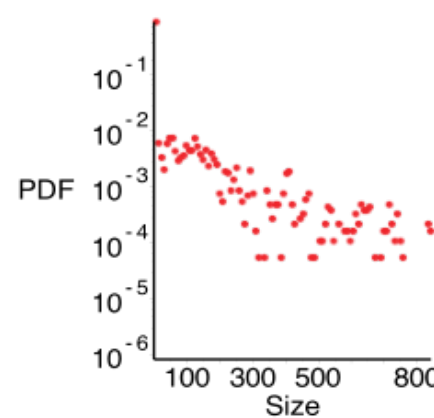
B



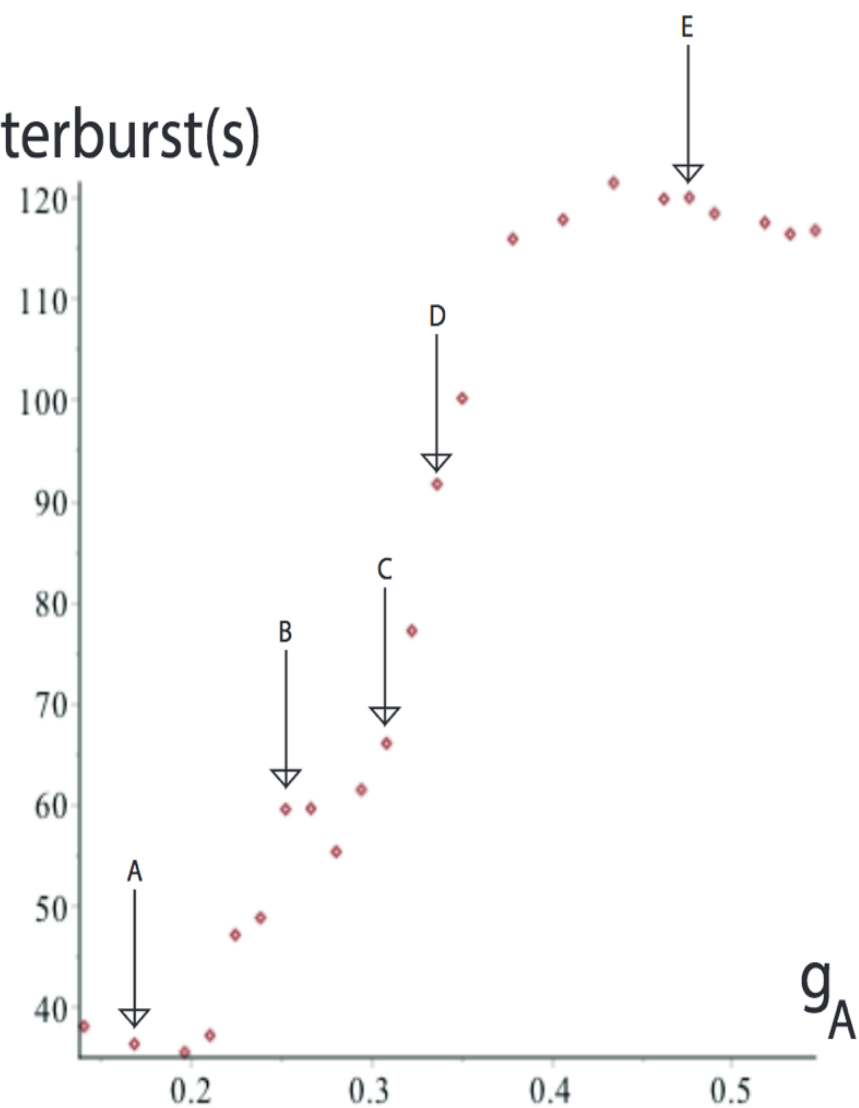
C



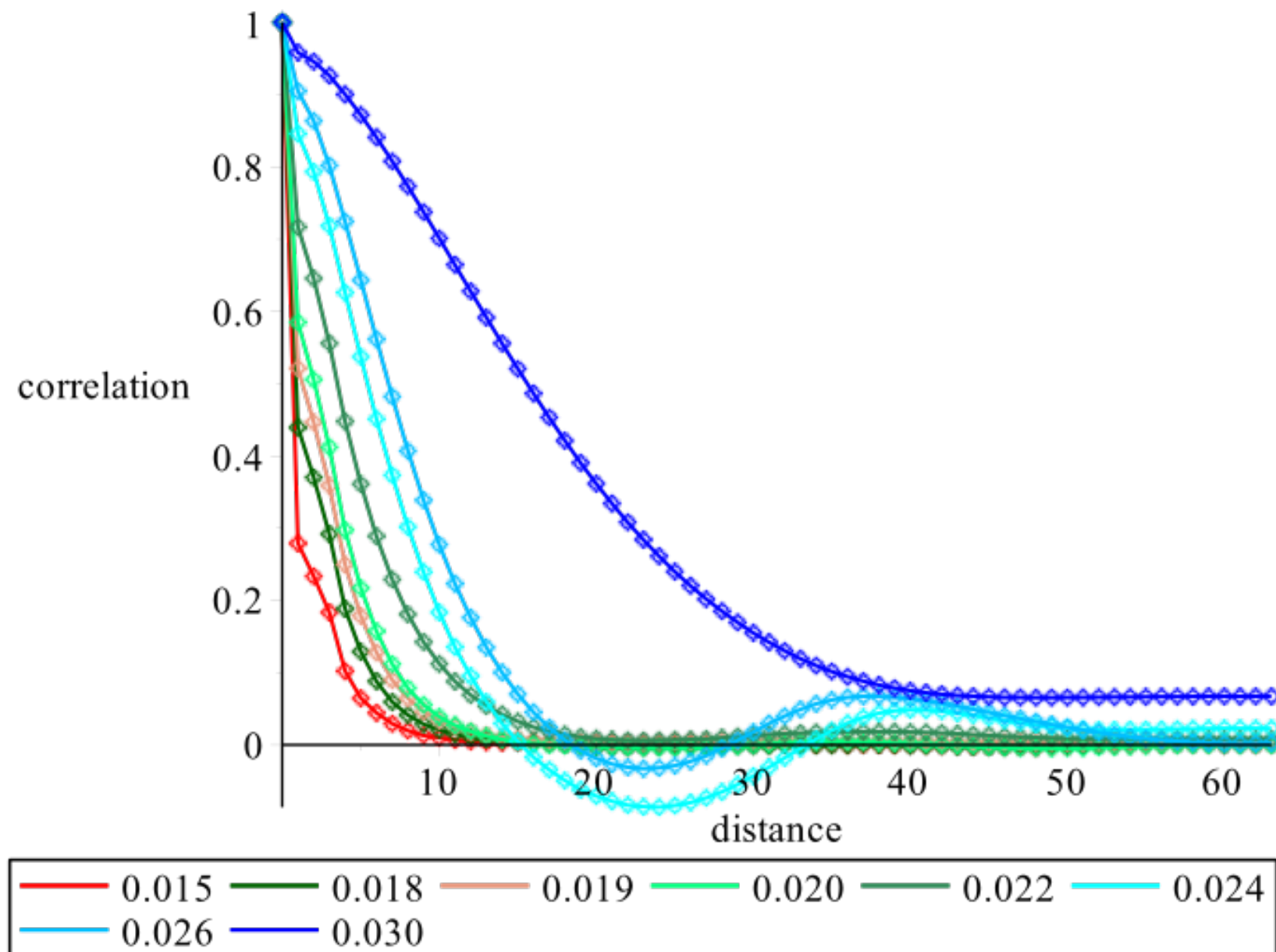
E



Interburst(s)

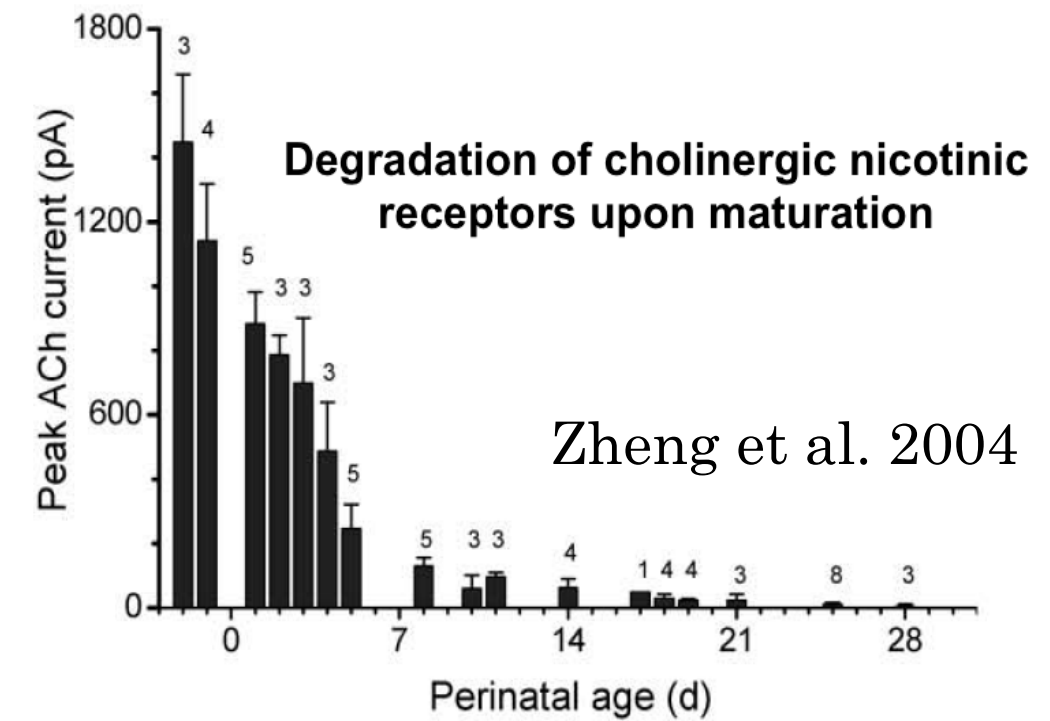


# Distance Pairwise Correlations

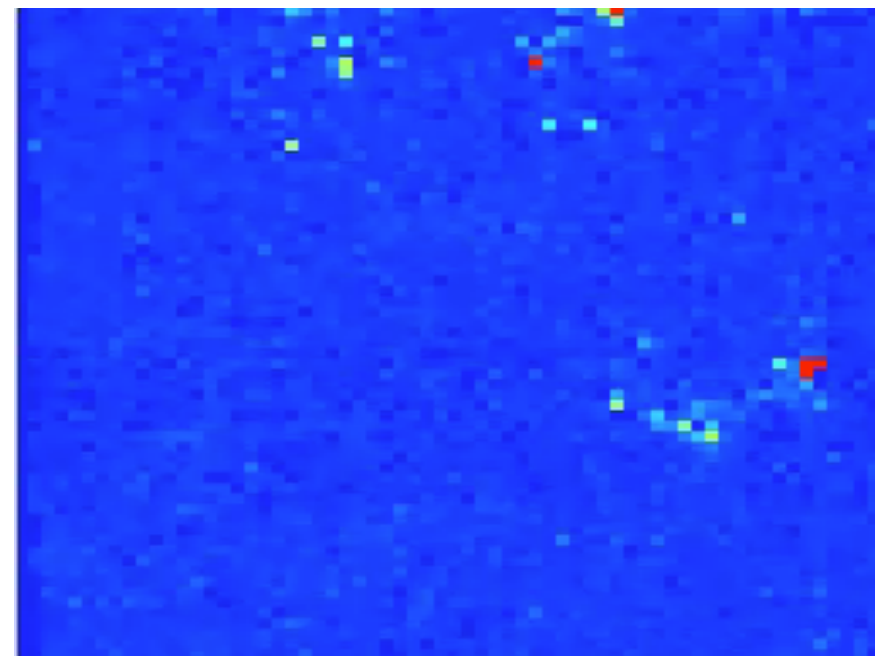


# Variability within retinal waves

## ii) Development

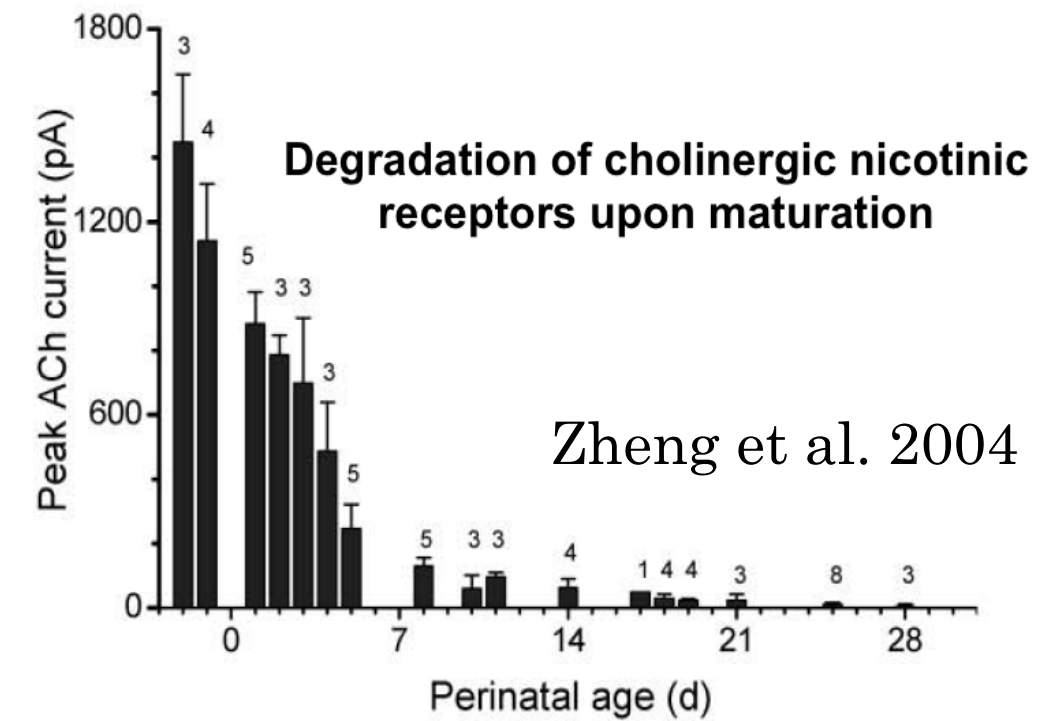


## iv) Spatial Variability

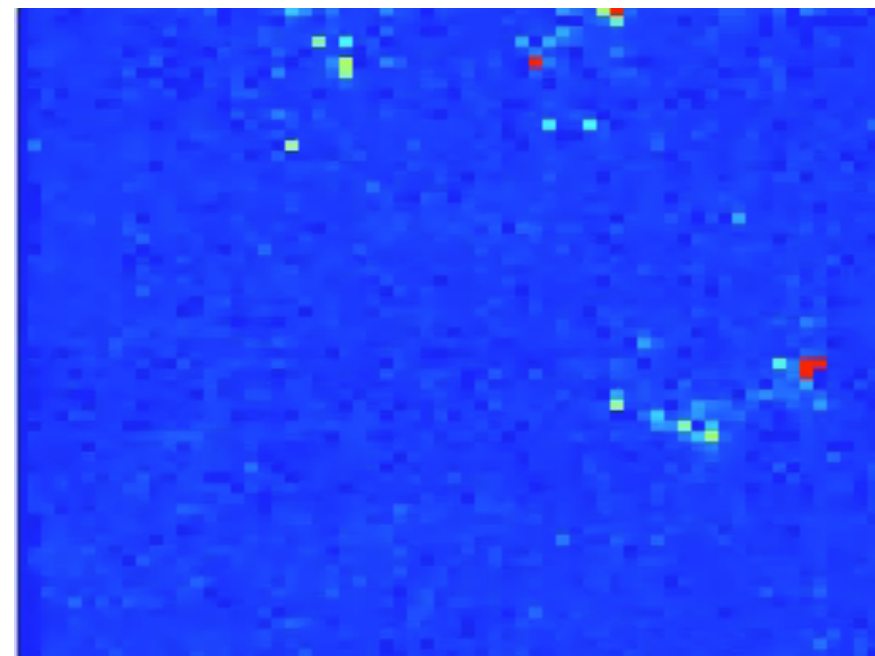


# Variability within retinal waves

## ii) Development



## iv) Spatial Variability



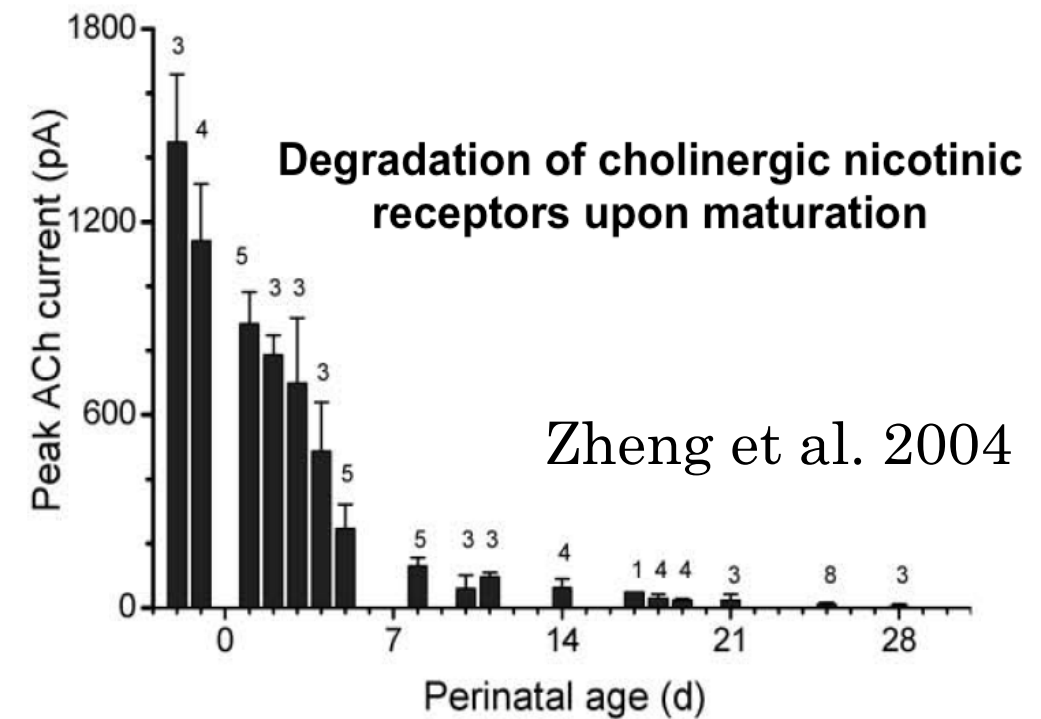


# Variability within retinal waves

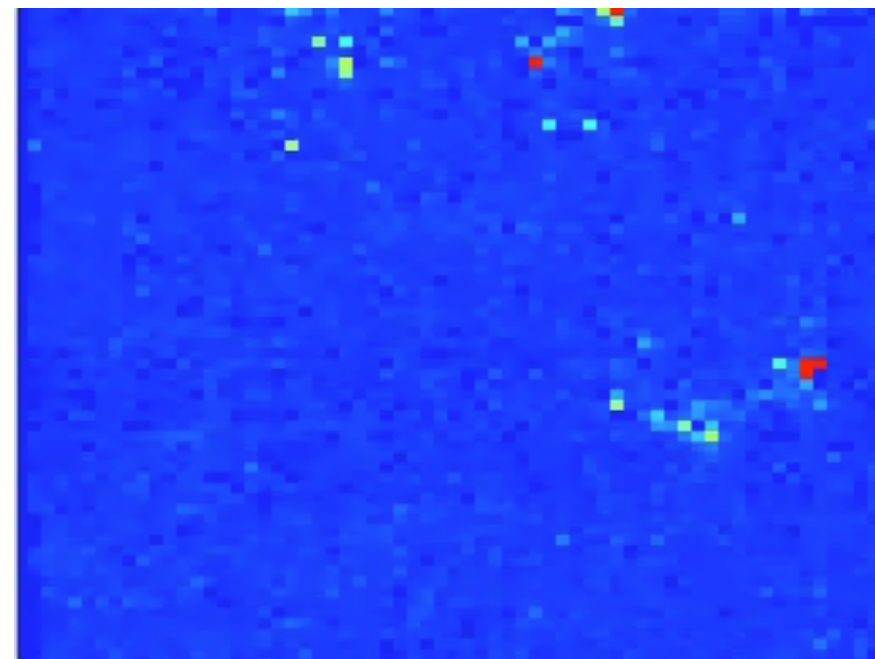
## Analytical results

1. There is a **critical** transition for the Acetylcholine conductance, given by the bifurcation analysis, where **waves start to appear**.
2. A wave propagates in the sAHP profile left by previous waves (**random landscape**)
3. Waves cannot cross each others => characteristic length, **exponential distribution**.
4. There is a critical point where waves are **power law** distributed.

## ii) Development



## iv) Spatial Variability





# Variability within retinal waves

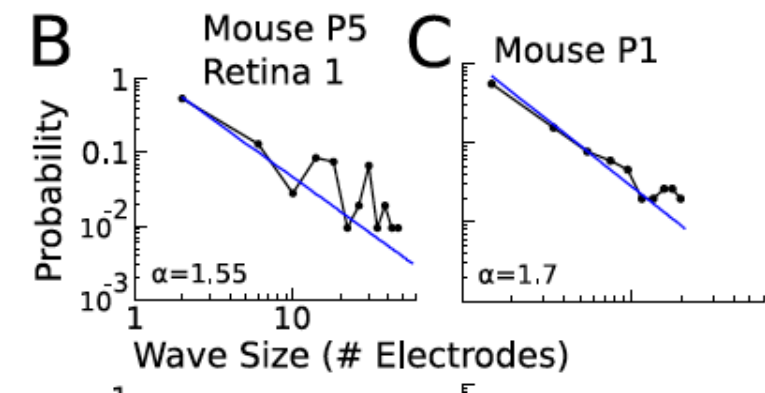
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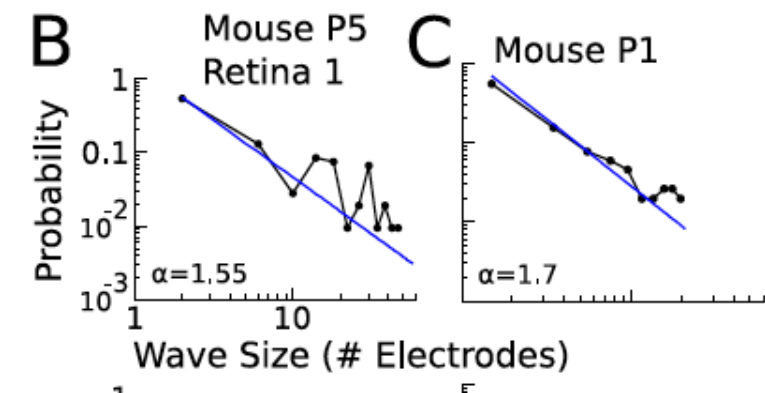
Hennig et al. 2009



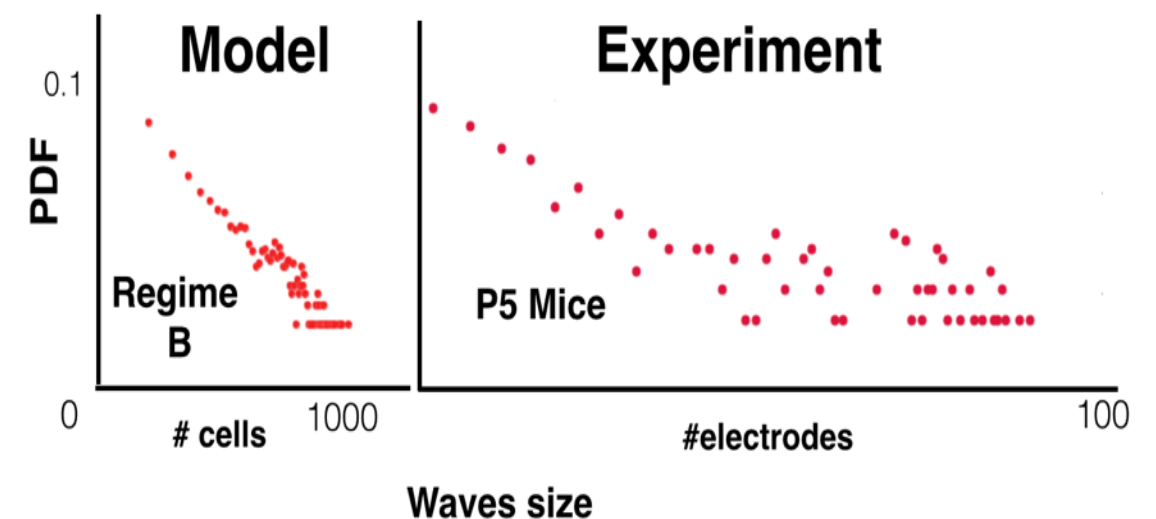
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Hennig et al. 2009



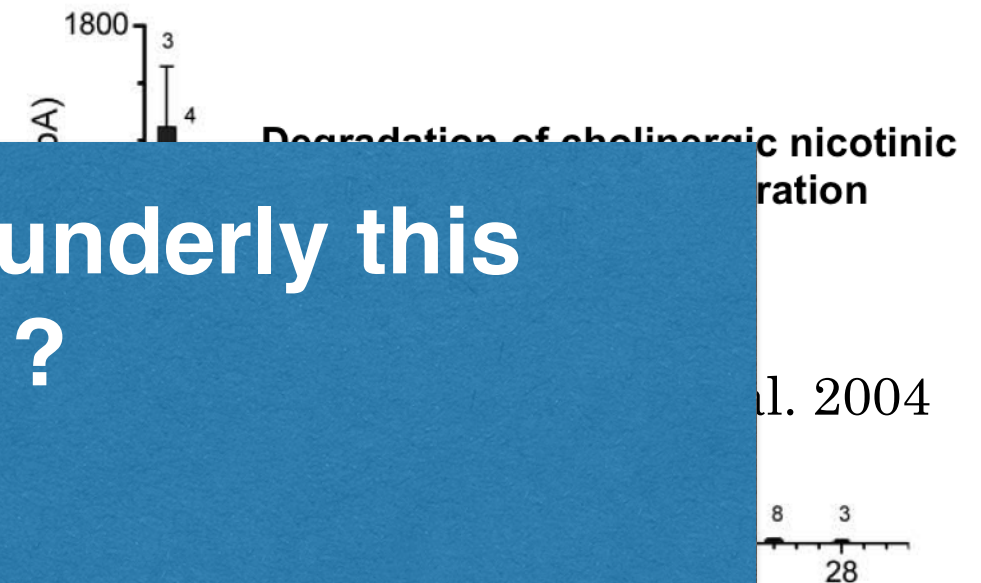
Experimentally varying Ach conductance  
(Data D. Karvouniari + Institut de la Vision)

# Variability within retinal waves

## i) Across species



## ii) Development



Which mechanisms underly this variability ?

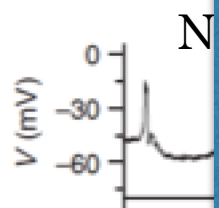
Randomness ?

Genetics ?

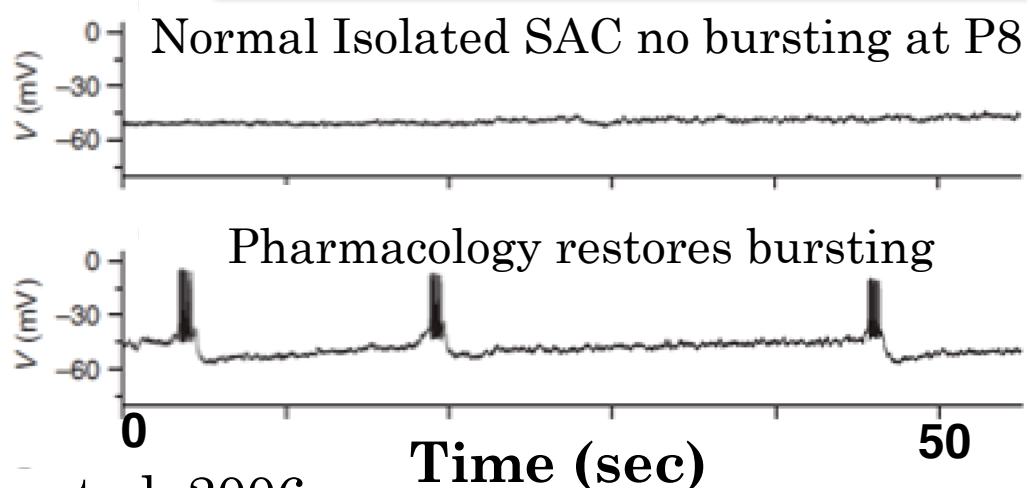
Non linear dynamics ?

## iii)

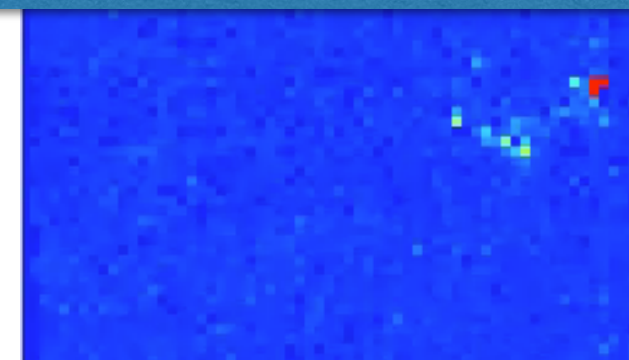
P4



P8



Zheng et al. 2006



Maccione et al. 2014

ability

have variable shapes due to a refractory mechanism which controls their borders.

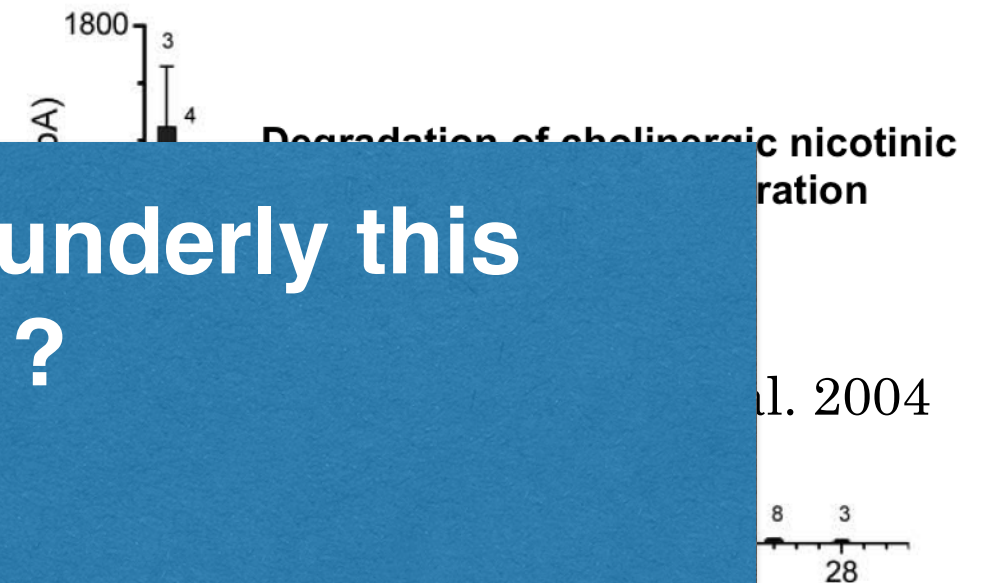


# Variability within retinal waves

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## ii) Development



Which mechanisms underly this variability ?

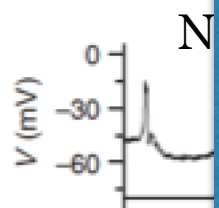
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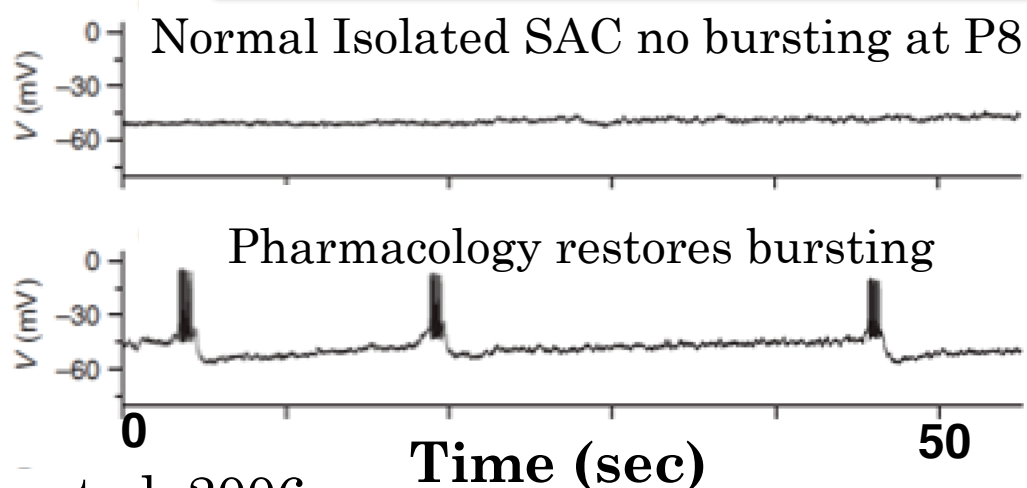
Non linear dynamics ?

## iii)

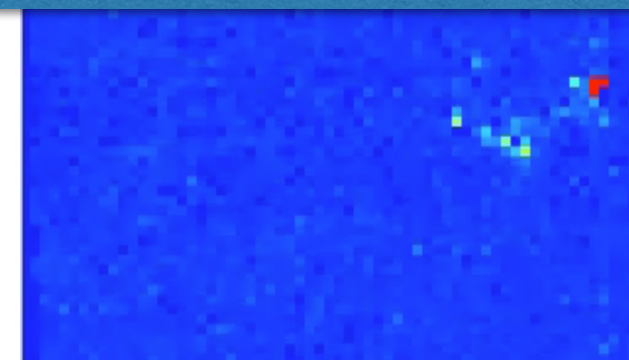
P4



P8



Zheng et al. 2006



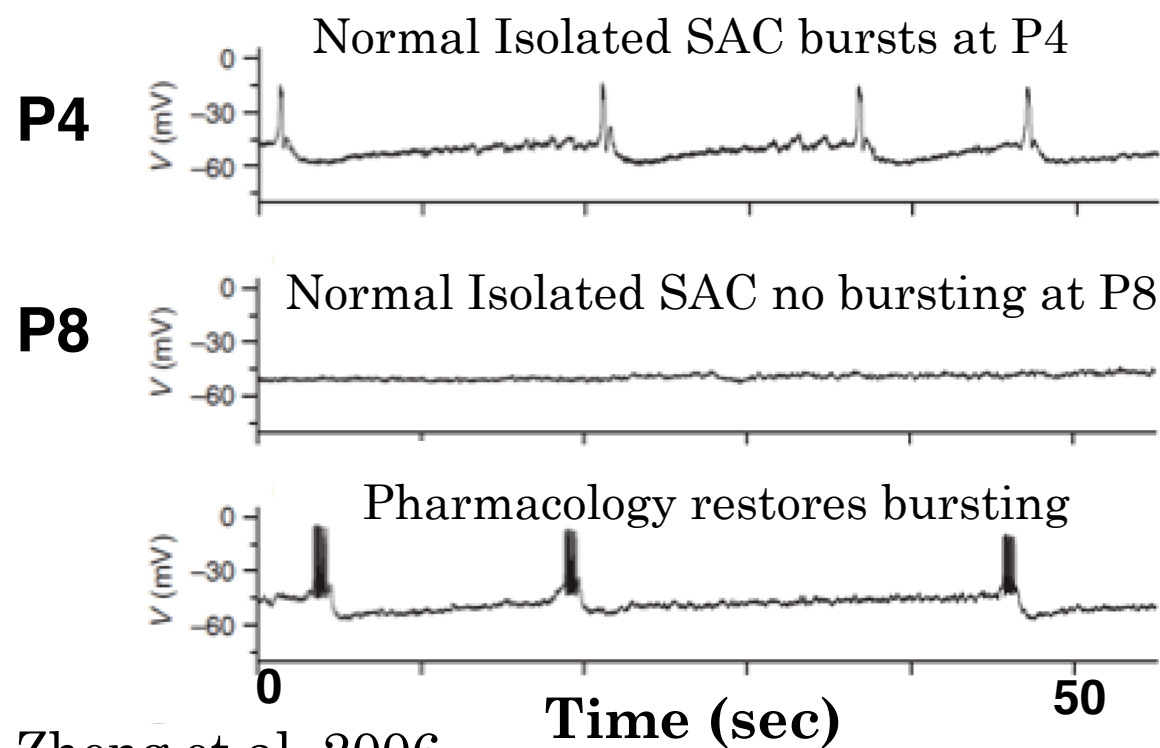
Maccione et al. 2014

have variable shapes due to a refractory mechanism which controls their borders.

# Variability within retinal waves

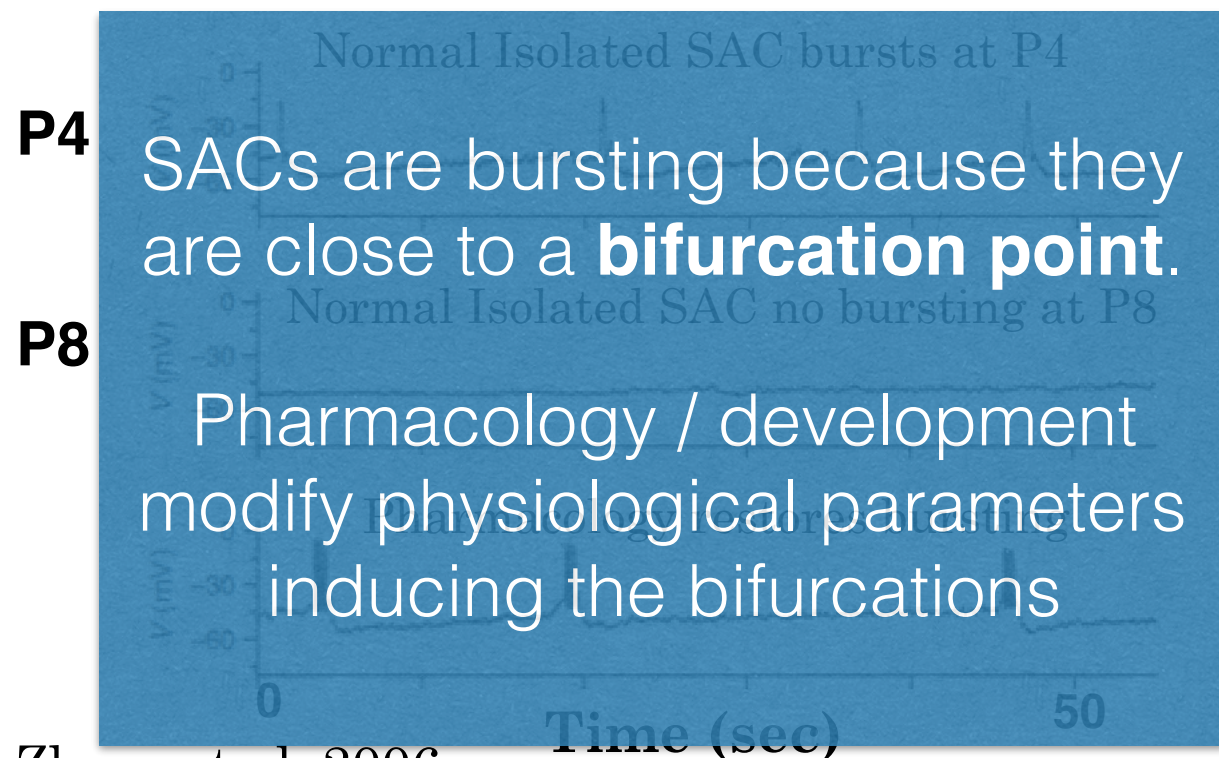
# Variability within retinal waves

## iii) Pharmacology



# Variability within retinal waves

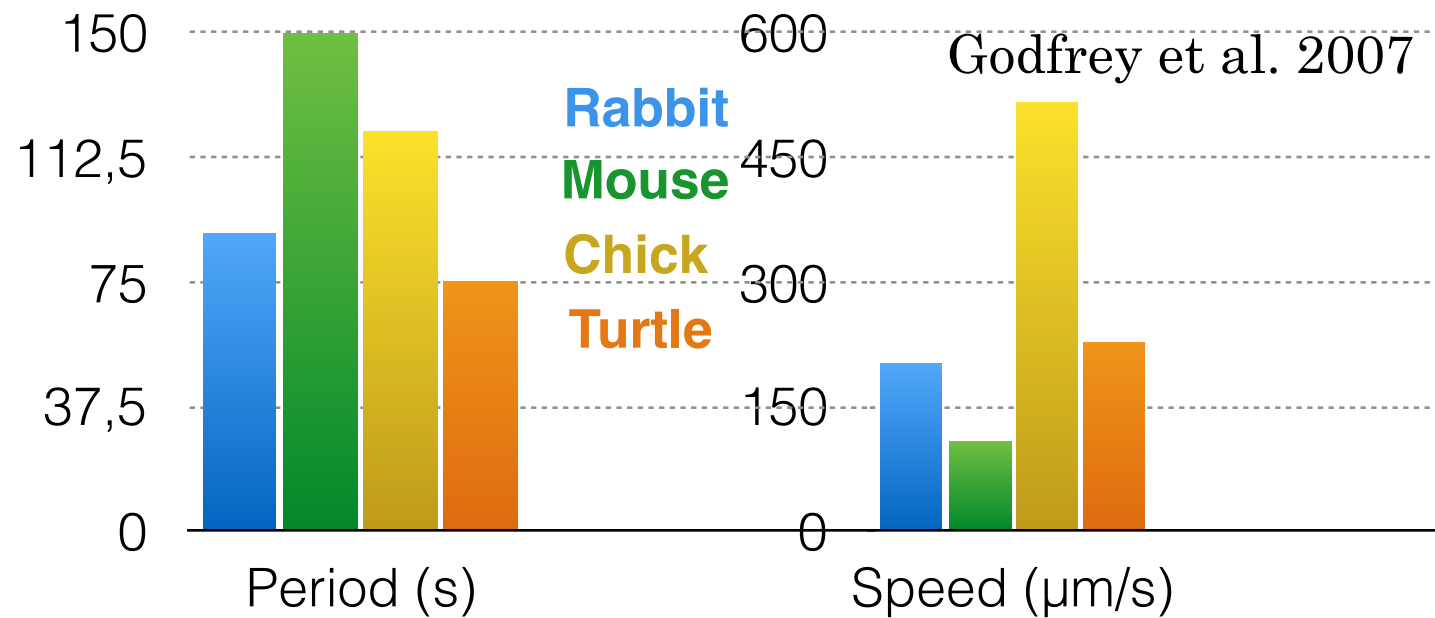
## iii) Pharmacology



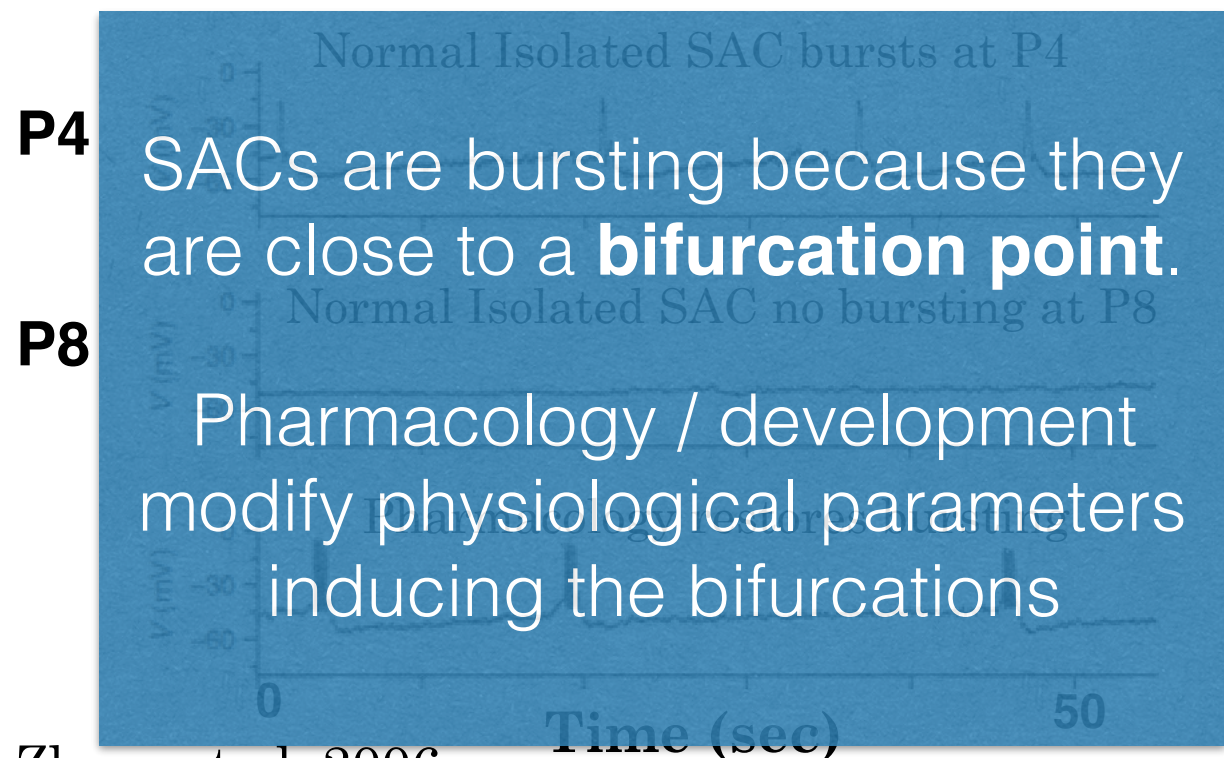


# Variability within retinal waves

## i) Across species

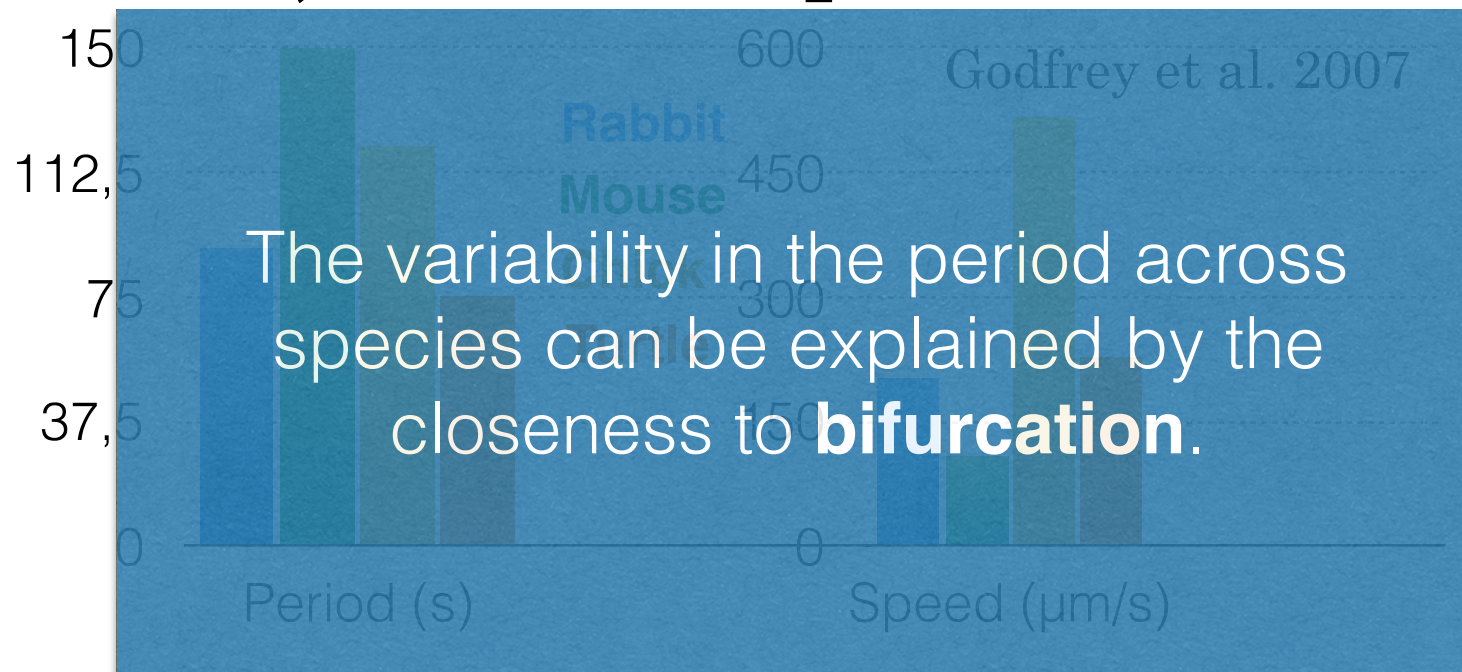


## iii) Pharmacology

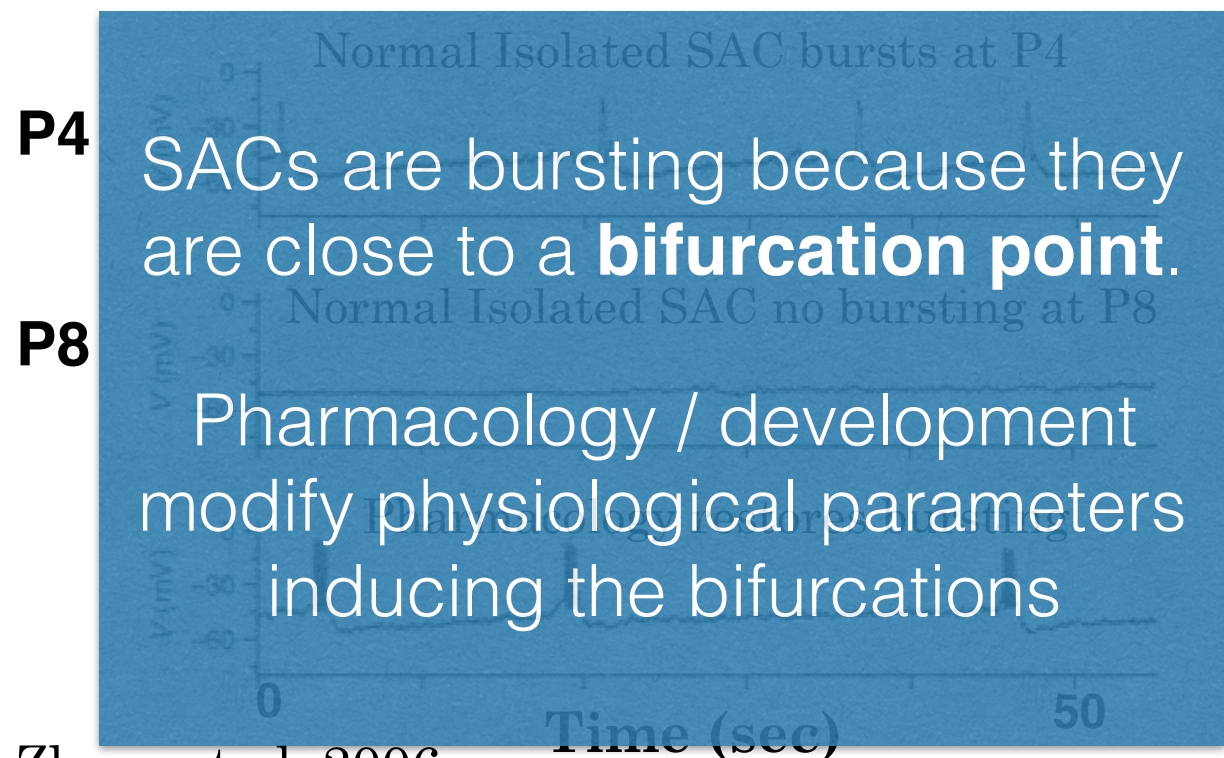


# Variability within retinal waves

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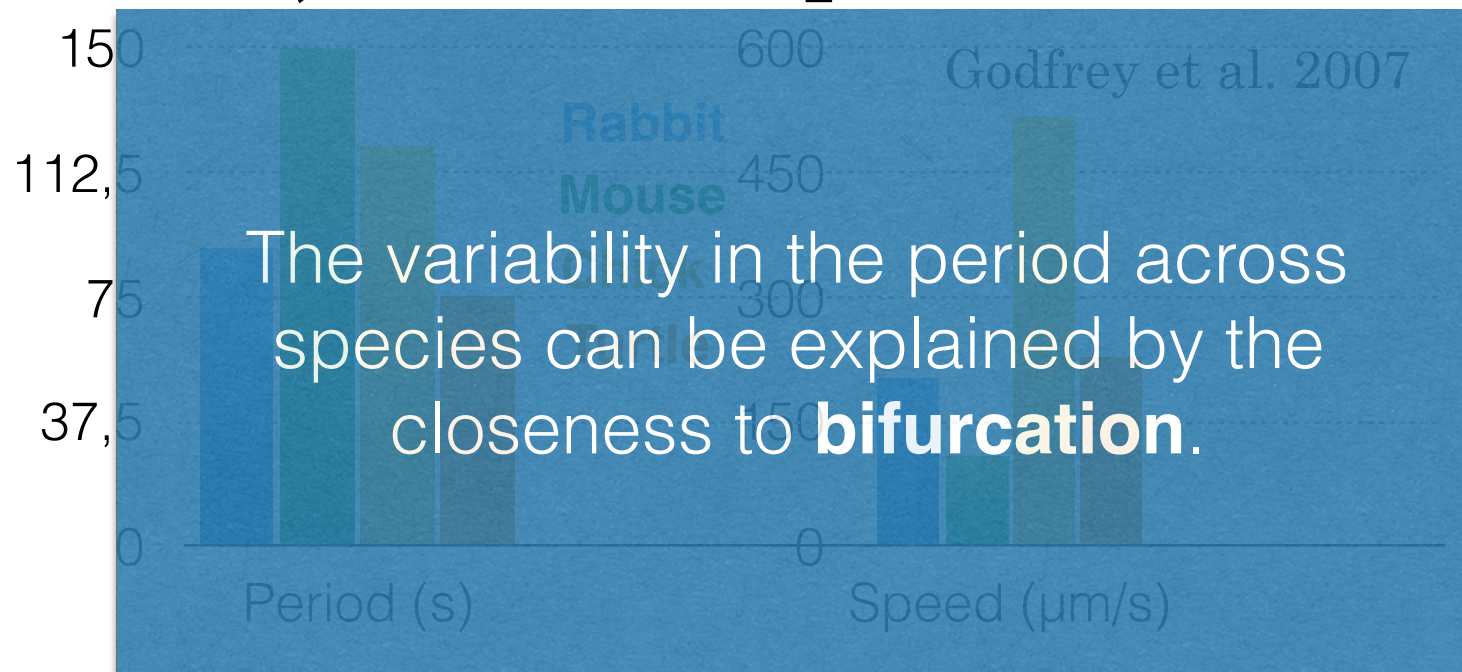
## iii) Pharmacology



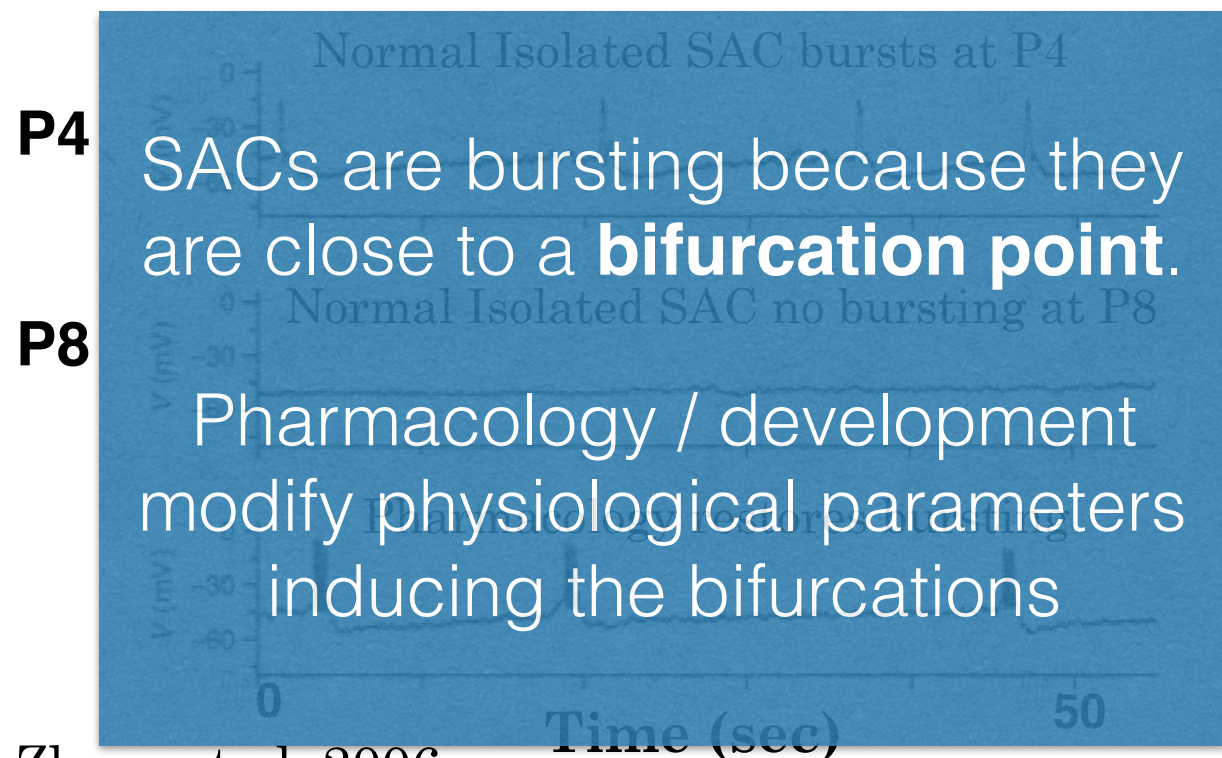


# Variability within retinal waves

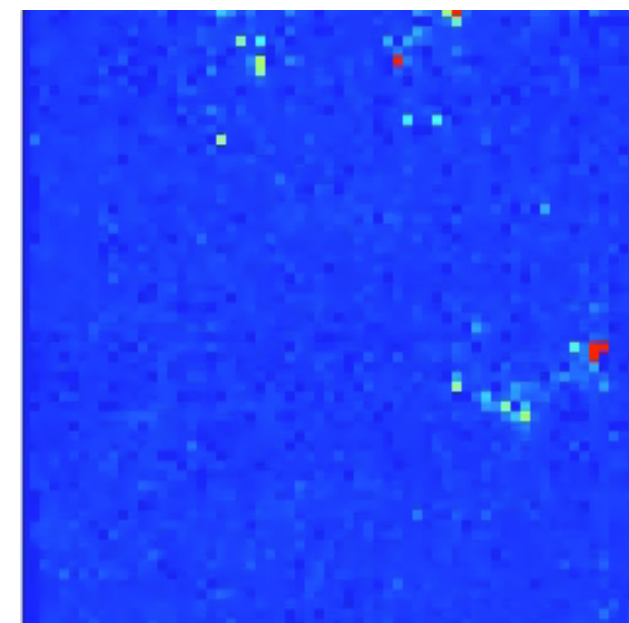
## i) Across species



## iii) Pharmacology



## iv) Spatial Variability



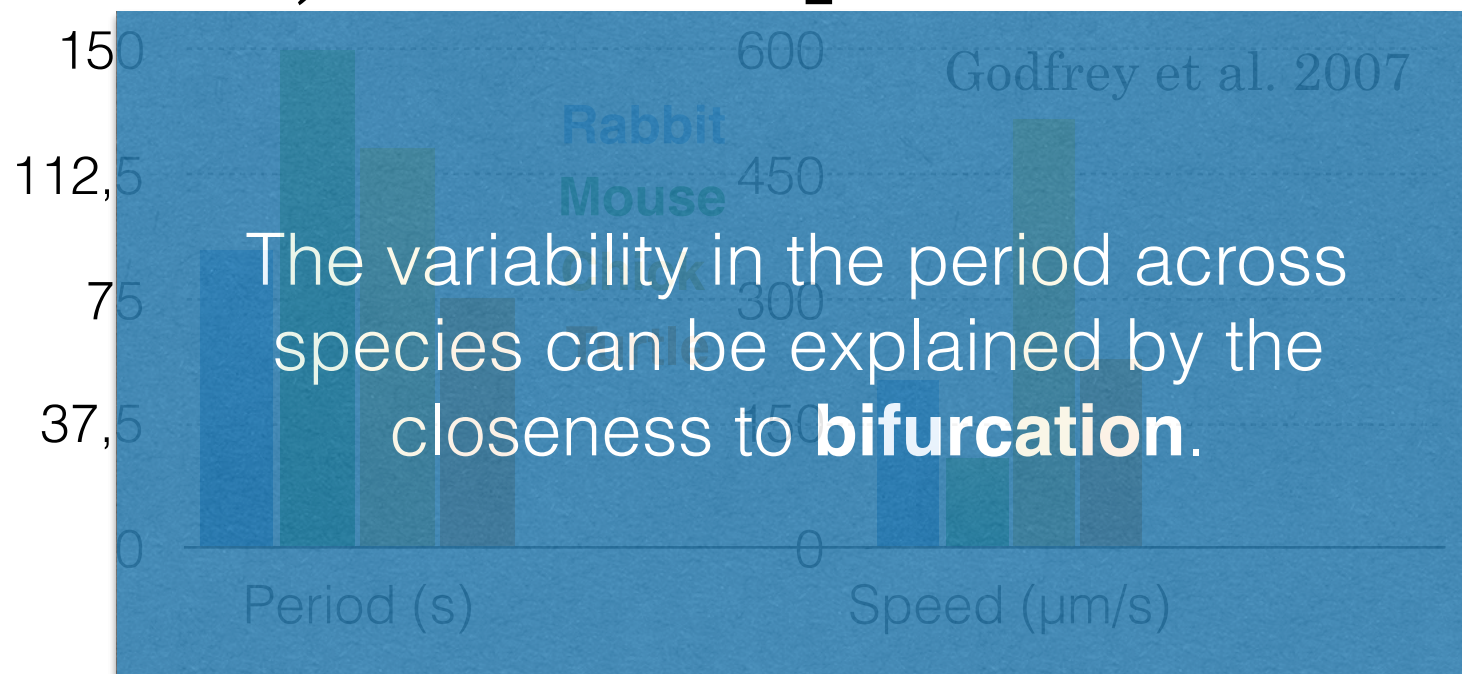
Maccione et al. 2014

Waves have variable shapes due to a refractory mechanism which controls their borders. It is called sAHP (slow AfterHyperPolarization) for stage II.

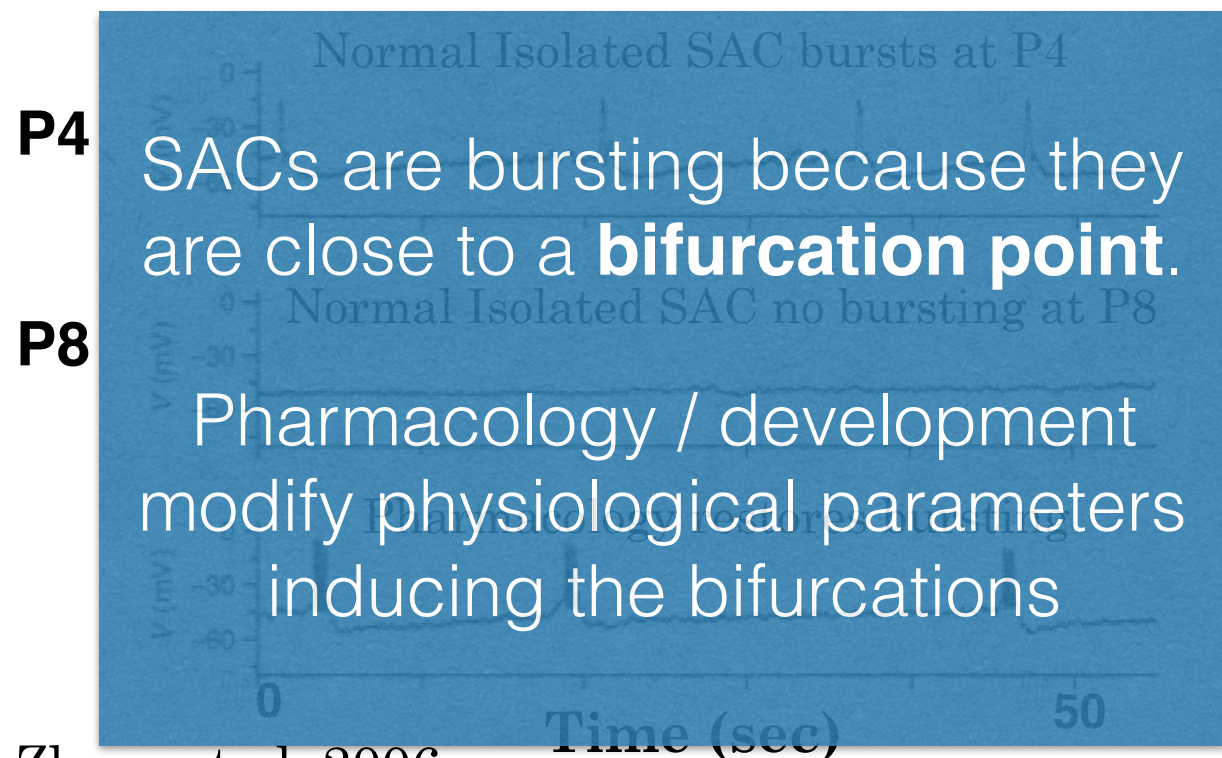


# Variability within retinal waves

## i) Across species



## iii) Pharmacology



## iv) Spatial Variability

Waves have variable shapes due to a refractory mechanism which controls their borders. It is called **Non linear dynamics** and **initial conditions** induce a wave propagation in a **random, history dependent landscape** inducing a strong variability in wave duration or size.

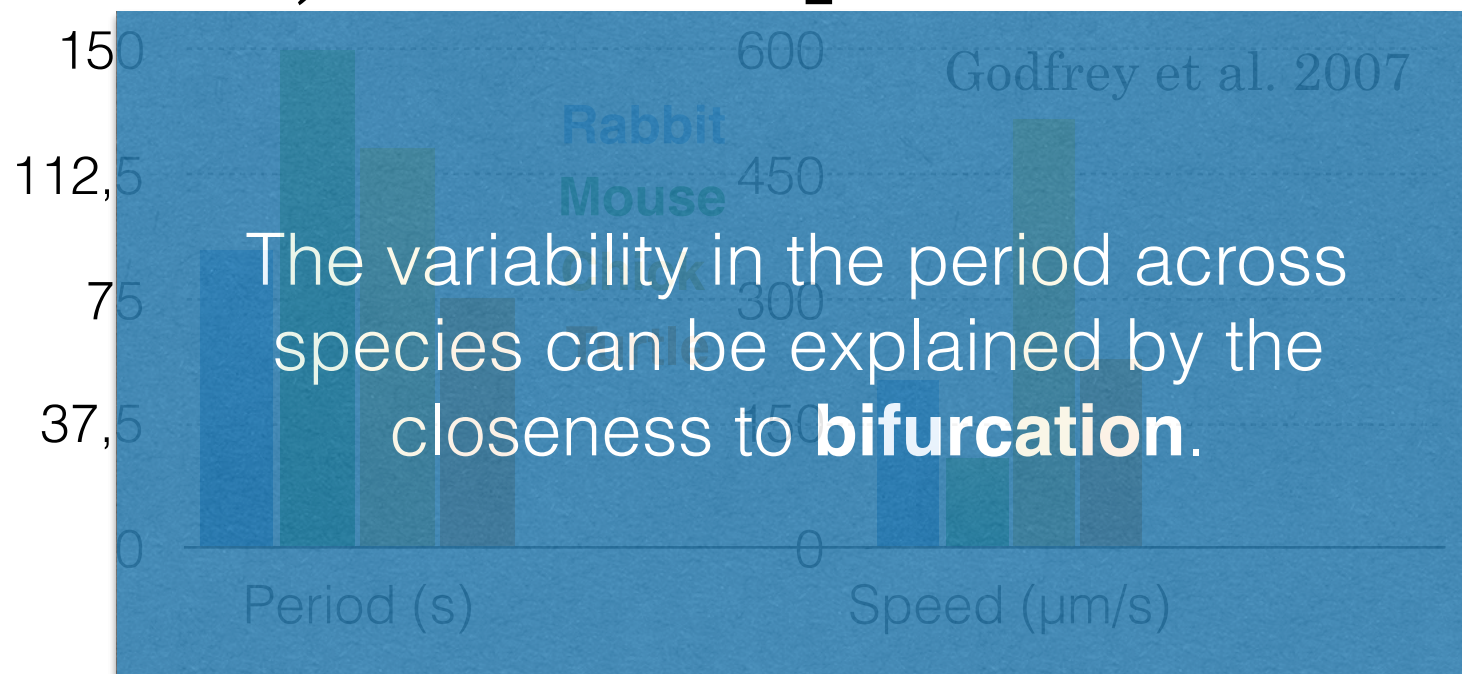
The distribution is, in general, exponential.

Maccione et al. 2014

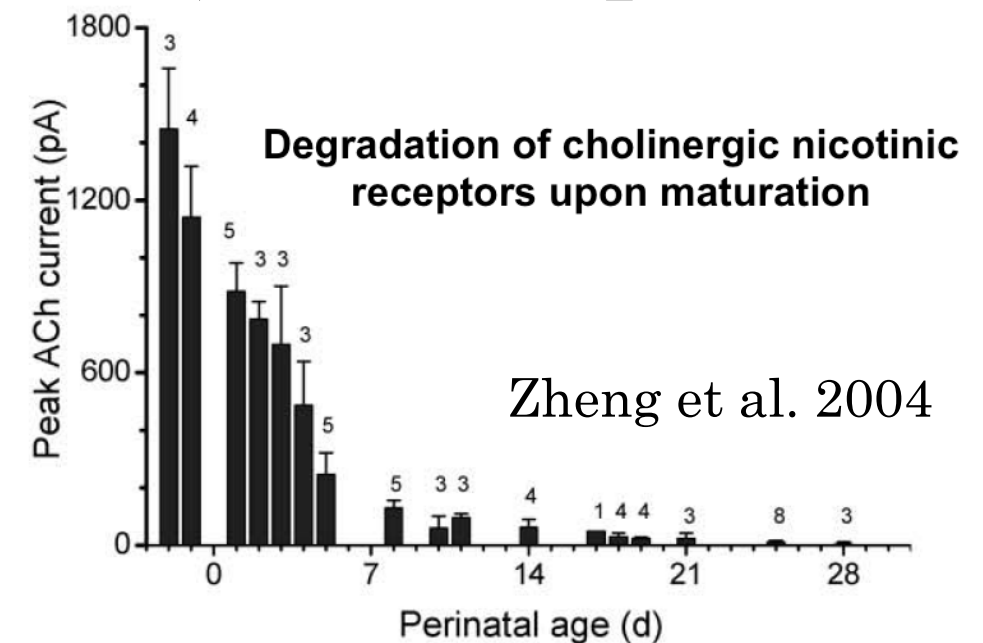


# Variability within retinal waves

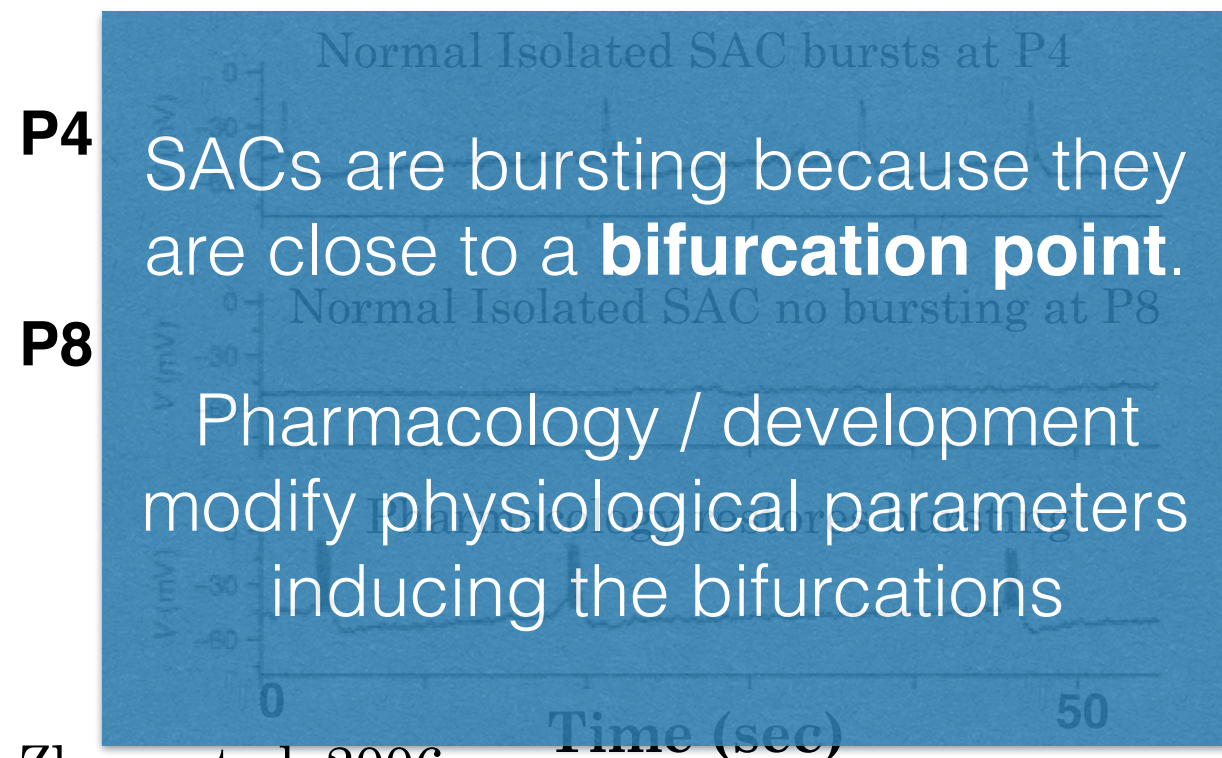
## i) Across species



## ii) Development



## iii) Pharmacology



## iv) Spatial Variability

Waves have variable shapes due to a refractory mechanism which controls their borders. It is called **landscape** inducing a strong variability in wave duration or size.

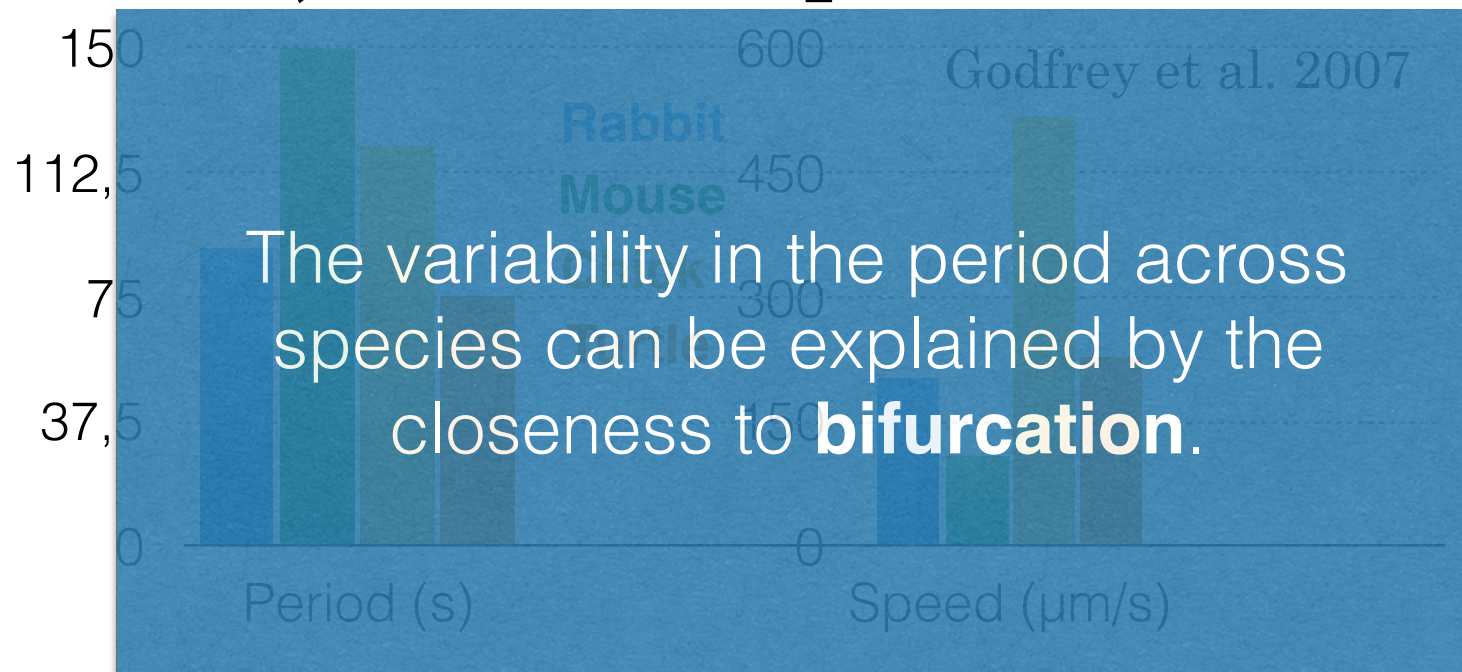
The distribution is, in general, exponential.

Maccione et al. 2014

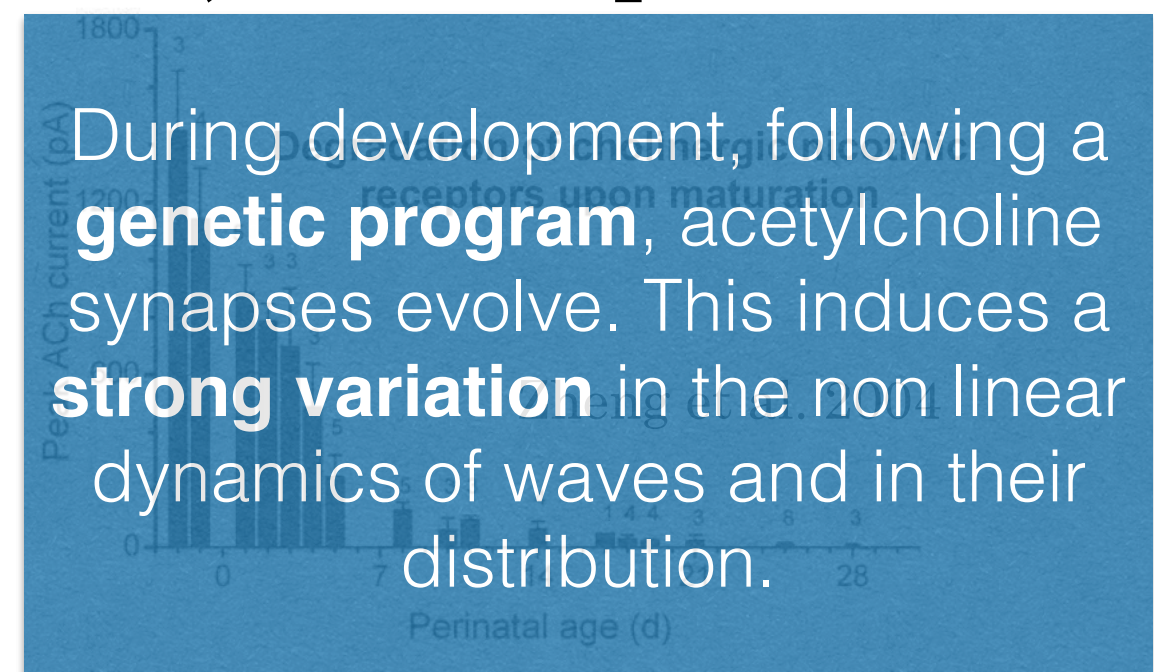


# Variability within retinal waves

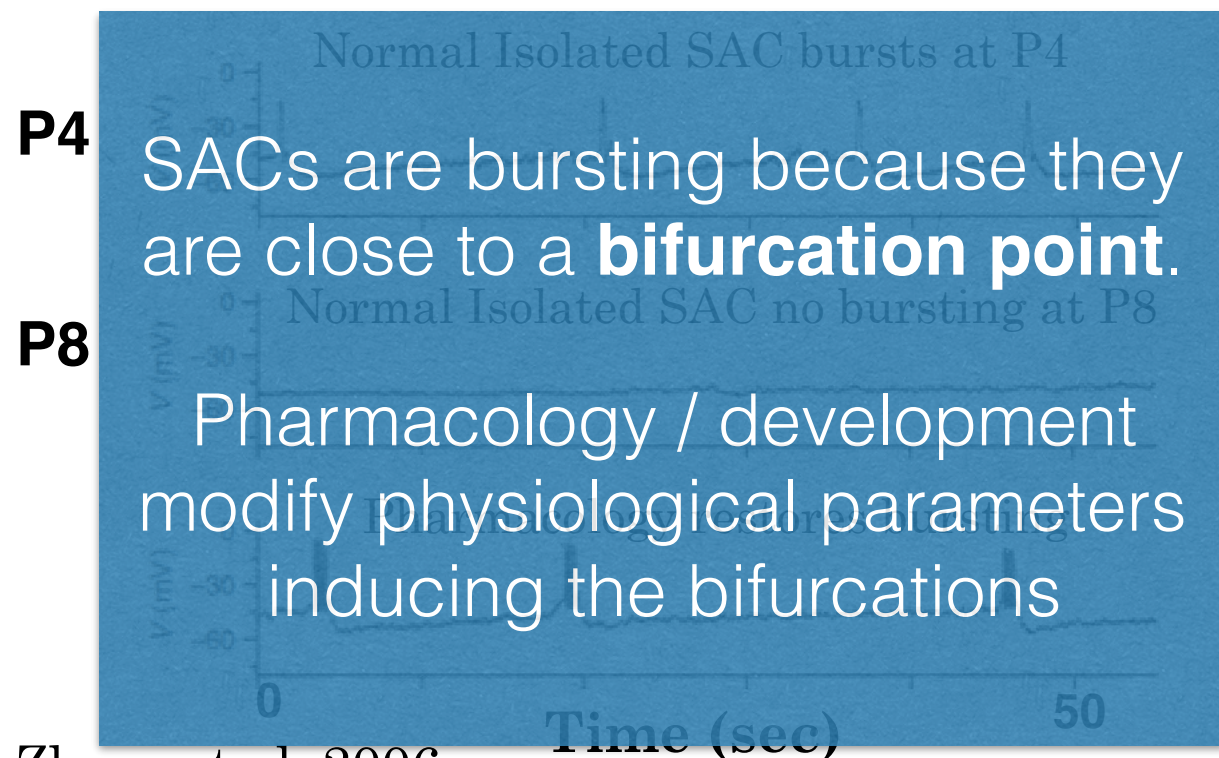
## i) Across species



## ii) Development



## iii) Pharmacology



Zheng et al. 2006

## iv) Spatial Variability

Waves have variable shapes due to a refractory mechanism which controls their borders. It is called **landscape** inducing a strong variability in wave duration or size.

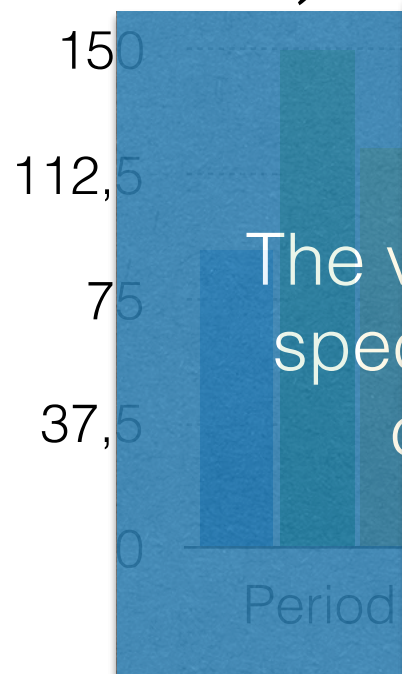
The distribution is, in general, exponential.

Maccione et al. 2014



# Variability within retinal waves

## i) Across species



## ii) Development

Is there a benefit for the visual system, at this stage of development, to generate power law distributed waves ?

following a  
cetylcholine  
s induces a  
ne non linear  
and in their  
n.

## iii) Which mechanism could enable this fine tuning ? Homeostasis ?

ability

P4  
SACs a  
are clos  
P8  
Nor

have variable  
types due to a  
nd **initial**  
ory mechanism  
opagation in a  
controls their  
**endent**  
rs. It is called

Pharmacology / development  
modify physiological parameters  
inducing the bifurcations

variability in  
wave duration or size.

The distribution is, in general, exponential.

Maccione et al. 2014

*Thanks*